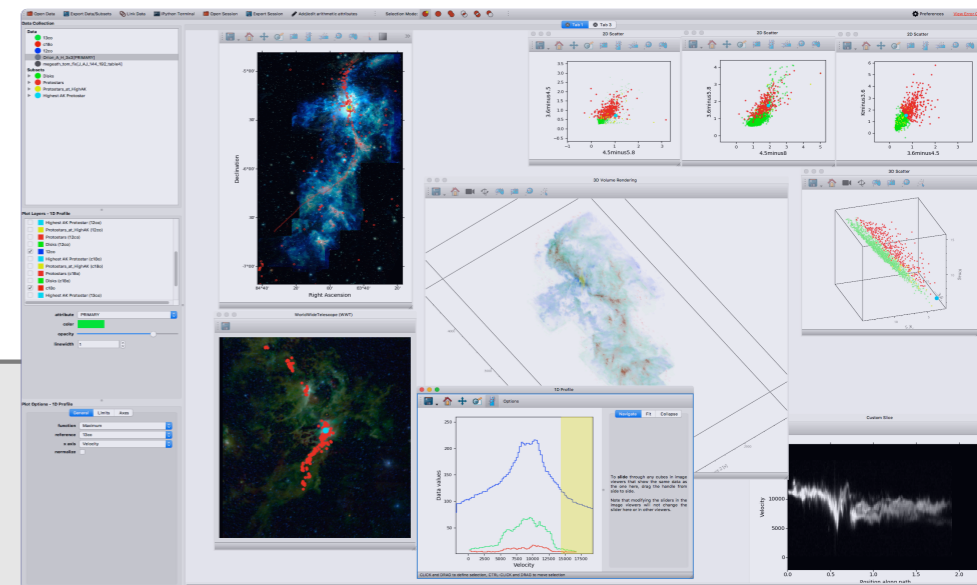


Preview

New Thinking on, and with, Data Visualization

Alyssa A. Goodman, Michelle A. Borkin, Thomas P. Robitaille



As the complexity and volume of datasets have increased along with the capabilities of modular, open-source, easy-to-implement, visualization tools, scientists' need for, and appreciation of, data visualization has risen too. Until recently, scientists thought of the "explanatory" graphics created at a research project's conclusion as "pretty pictures" needed only for journal publication or public outreach. The plots and displays produced during a research project – often intended only for experts – were thought of as a separate category, what we here call "exploratory" visualization. In this view, discovery comes from exploratory visualization, and explanatory visualization is just for communication. Our aim in this paper is to spark conversation amongst scientists, computer scientists, outreach professionals, educators, and graphics and perception experts about how to foster flexible data visualization practices that can facilitate discovery and communication at the same time. We present an example of a new finding made using the glue visualization environment to demonstrate how the border between explanatory and exploratory visualization is easily traversed. The linked-view principles as well as the actual code in glue are easily adapted to astronomy, medicine, and geographical information science – all fields where combining, visualizing, and analyzing several high-dimensional datasets yields insight. Whether or not scientists can use such a flexible "undisciplined" environment to its fullest potential without special training remains to be seen. We conclude with suggestions for improving the training of scientists in visualization practices, and of computer scientists in the iterative, non-workflow-like, ways in which modern science is carried out.

Comments: Submitted as an invited "Perspectives" Paper for PNAS, in conjunction with the 2018 Sackler Colloquium

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Categories

Primary: Instrumentation and Methods for Astrophysics (astro-ph.IM)

Cross lists:

This article is currently **submitted**.



[View Article](#)

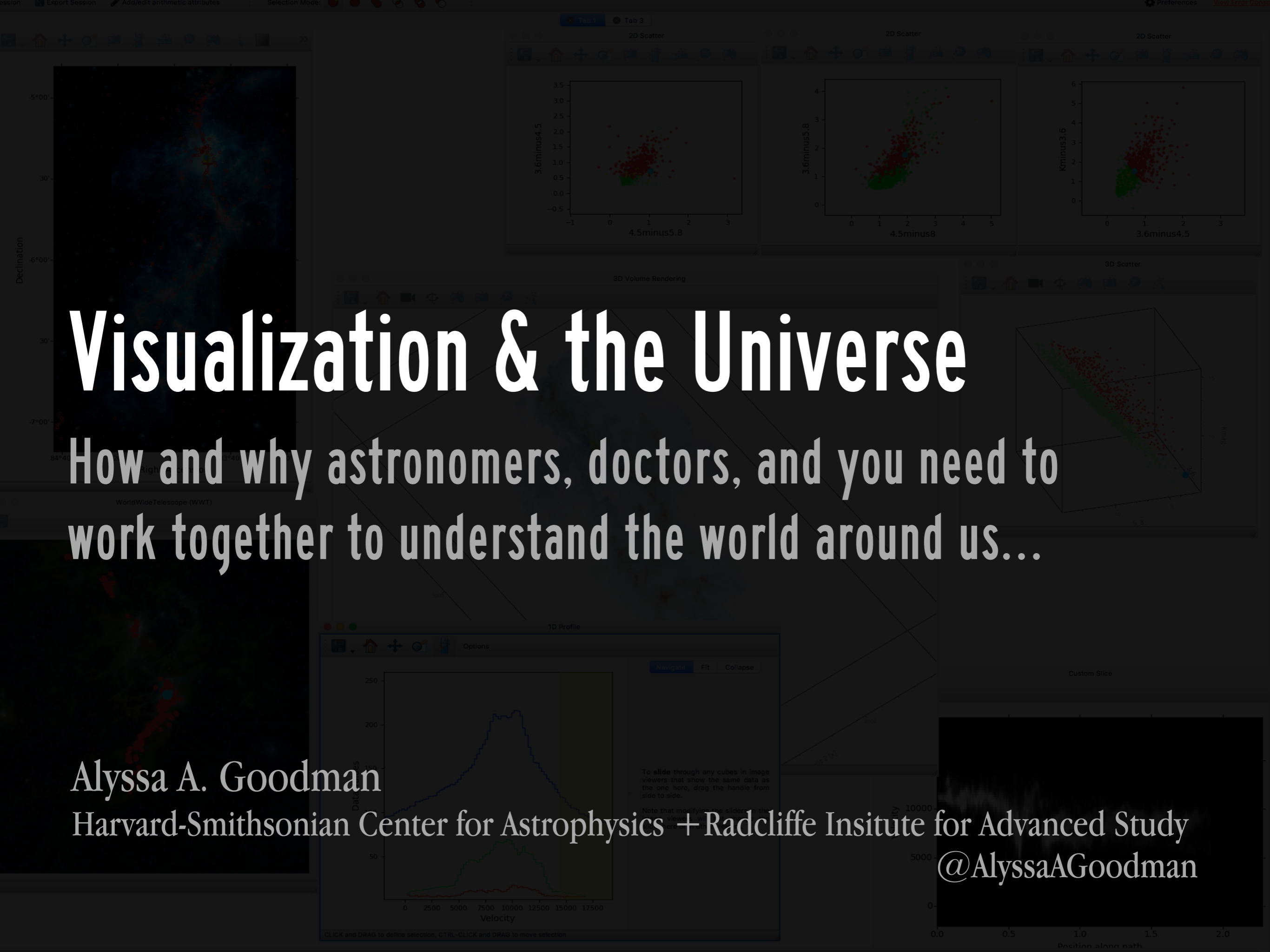
Goodman, Borkin & Robitaille 2018, available on arXiv

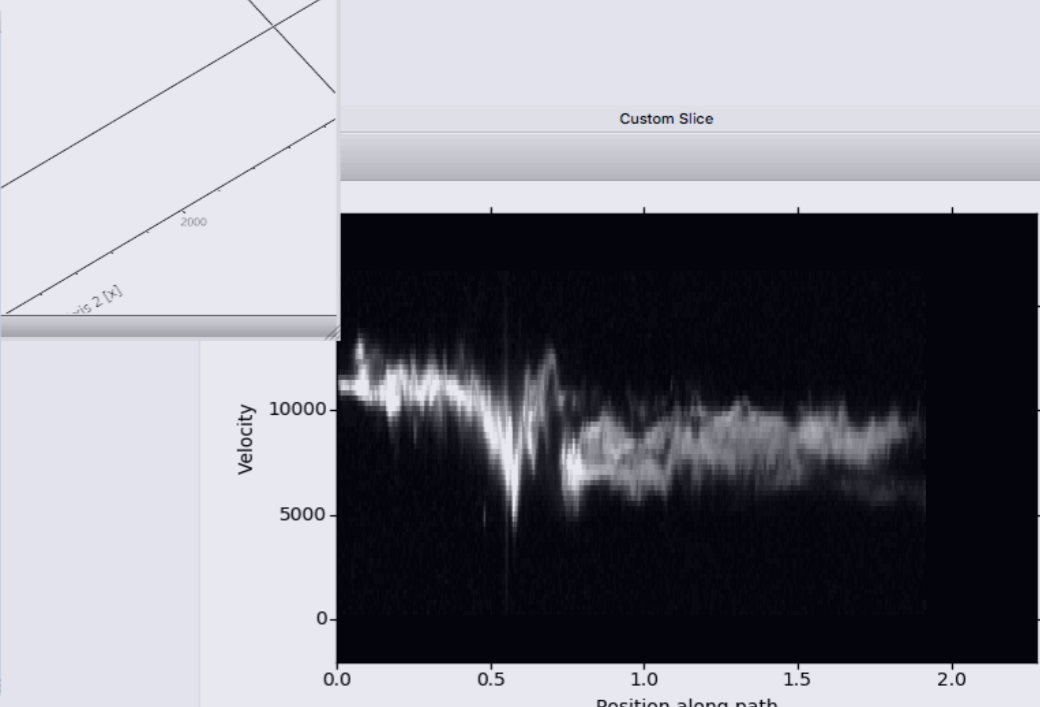
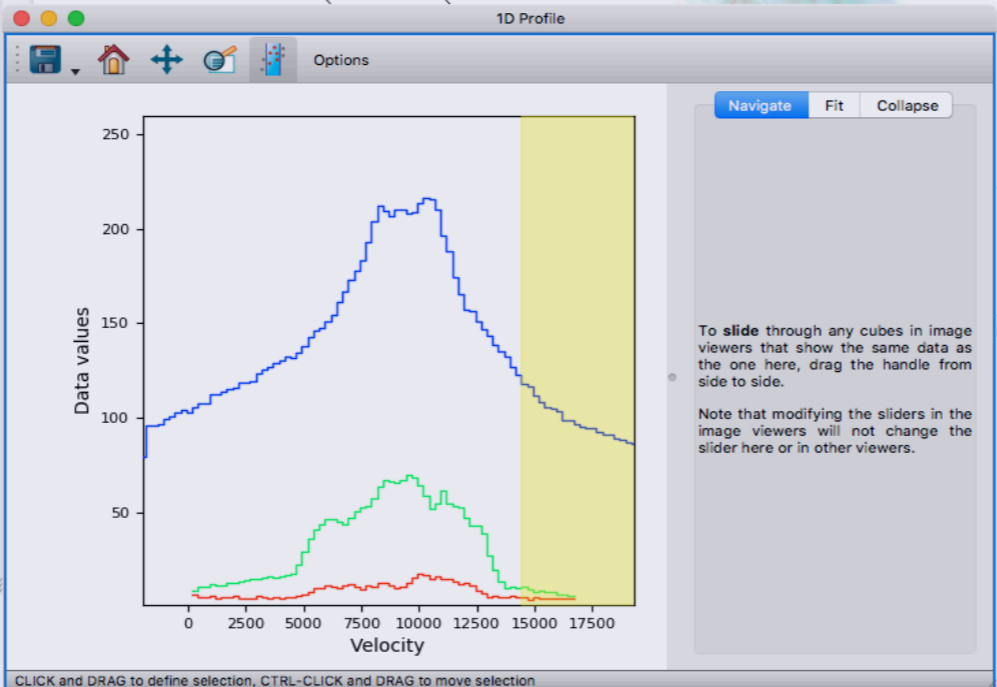
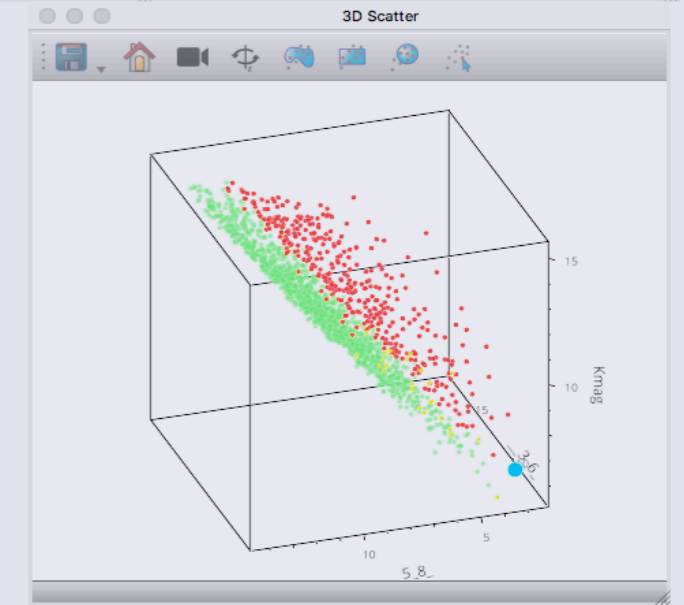
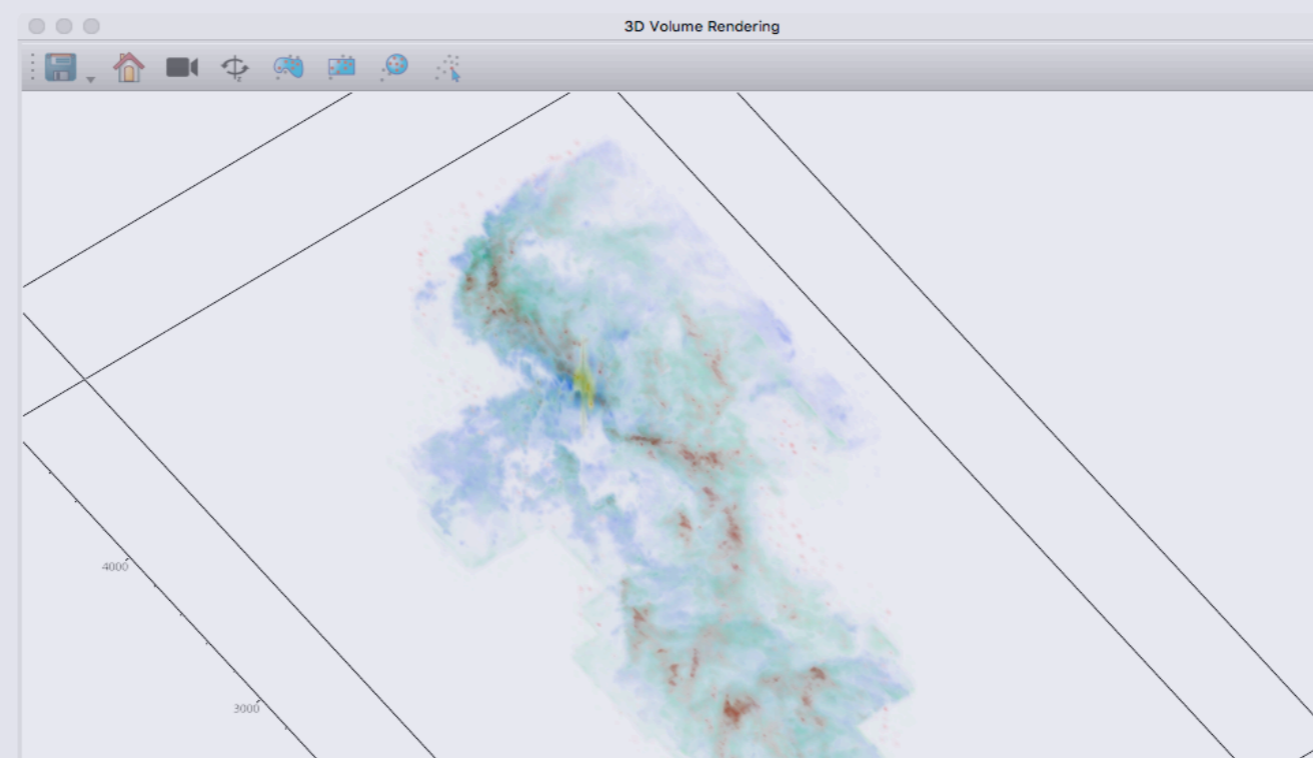
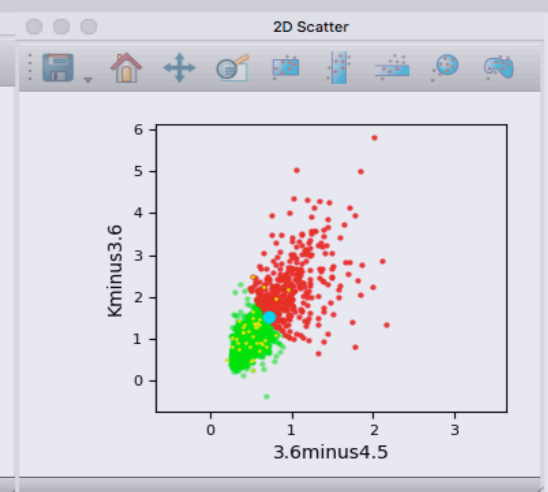
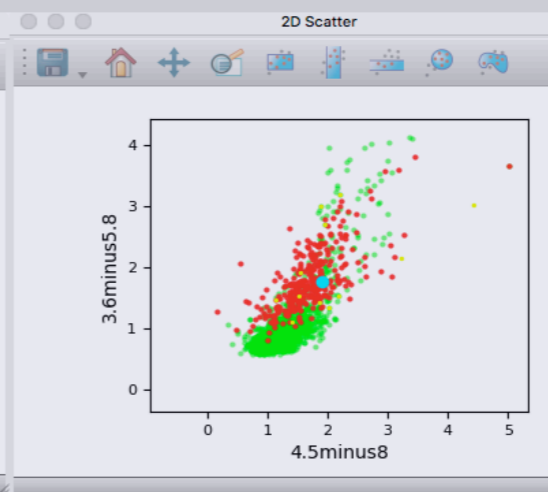
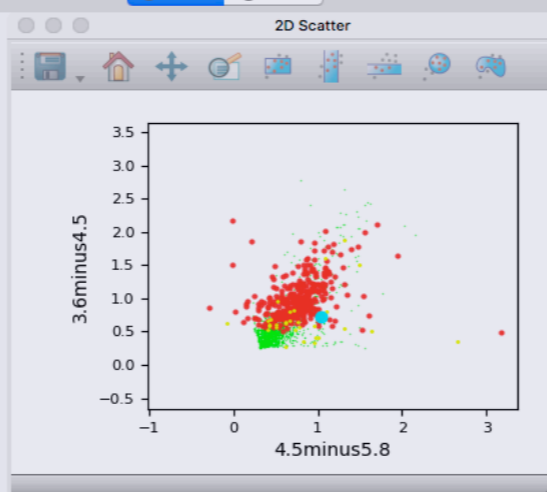
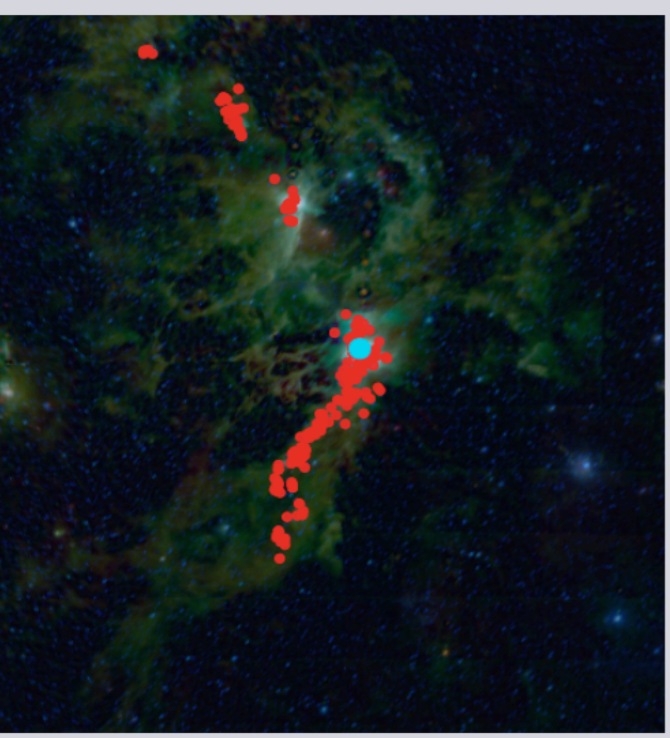
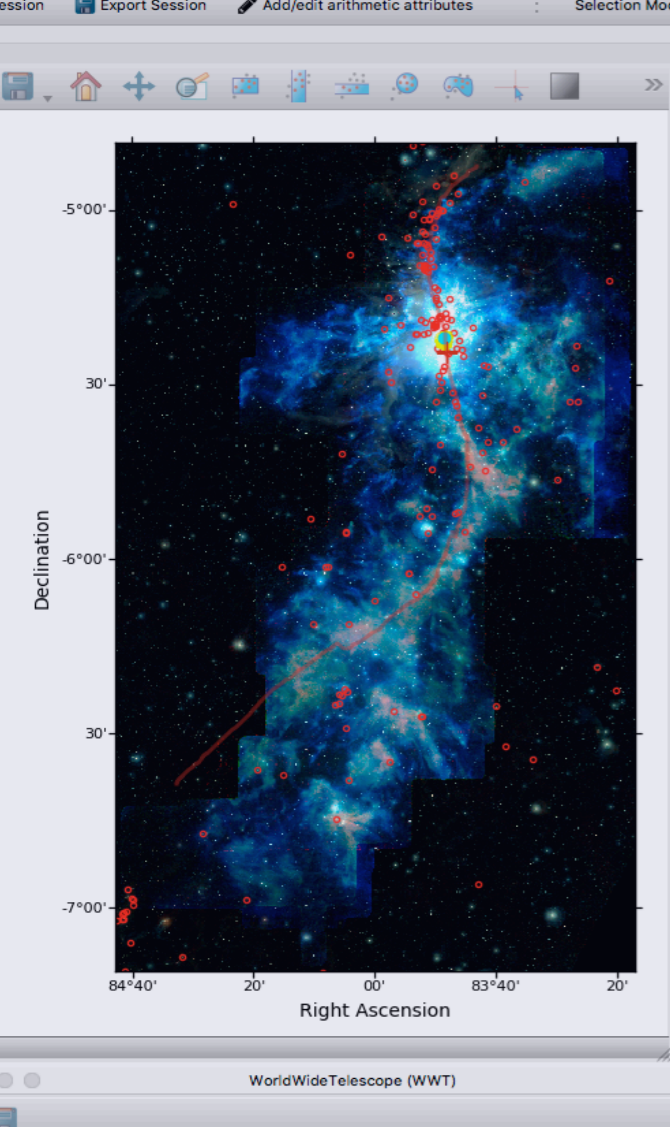
Visualization & the Universe

How and why astronomers, doctors, and you need to work together to understand the world around us...

Alyssa A. Goodman

Harvard-Smithsonian Center for Astrophysics + Radcliffe Institute for Advanced Study
@AlyssaAGoodman





1610



SIDEREUS NUNCIUS

On the third, at the seventh hour, the sequence. The eastern one was 1 minute, the closest western one 2 minutes; and the

East * ○ * West

10 minutes removed from this one. They were absolutely on the same straight line and of equal magnitude.

On the fourth, at the second hour, there were four stars around Jupiter, two to the east and two to the west, and arranged precisely

East * ○ * West

on a straight line, as in the adjoining figure. The easternmost was distant 3 minutes from the next one, while this one was 40 seconds from Jupiter; Jupiter was 4 minutes from the nearest western one, and this one 6 minutes from the westernmost one. Their magnitudes were nearly equal; the one closest to Jupiter appeared a little smaller than the rest. But at the seventh hour the eastern star was 30 seconds apart. Jupiter was 2 minutes from the

East ** ○ **

one, while he was 4 minutes from the next western one was 3 minutes from the westernmost one. They and extended on the same straight line along the ecliptic.

On the fifth, the sky was cloudy.

On the sixth, only two stars appeared flanking Jupiter

East * ○ *

in the adjoining figure. The eastern one was 2 minutes from the next western one 3 minutes from Jupiter. They were on the same straight line with Jupiter and equal in magnitude.

On the seventh, two stars stood near Jupiter, but not on the same straight line.

1665



1895

ASTROPHYSICAL JOURNAL

AN INTERNATIONAL REVIEW OF SPECTROSCOPY AND ASTRONOMICAL PHYSICS

VOLUME I JANUARY 1895 NUMBER 1

ON THE CONDITIONS WHICH AFFECT THE SPECTRO-PHOTOGRAPHY OF THE SUN.

By ALBERT A. MICHELSON.

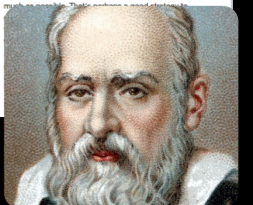
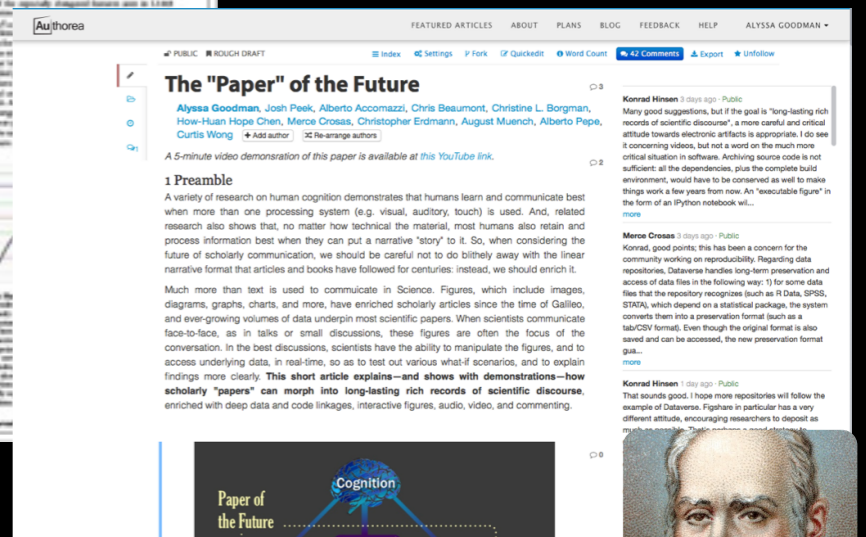
The recent developments in solar spectro-photography are in great measure due to the device originally suggested by Jansen and perfected by Hale and Deslandres, by means of which a photograph of the Sun's prominences may be obtained at a time as readily as it is during an eclipse. The essential features of this device are the simultaneous movements of the collimator-slit across the Sun's image, with that of a second slit (the focus of the photographic lens) over a photographic plate. If these relative motions are so adjusted that the same spectral line always falls on the second slit, then a photographic image of the Sun will be reproduced by light of this particular wavelength.

Evidently the process is not limited to the photography of the prominences, but extends to all other peculiarities of structure which emit radiations of approximately constant wavelength; and the efficiency of the method depends very largely upon the contrast which can be obtained by the greater effect

2009



2015



4 Centuries from Galileo to Galileo

Paper of the Future

Cognition

1610: Galileo Discovers Jupiter's Moons

Scipio Principe

Galileo Galilei, Familiare Seruo della Ser.^a V.^a inuigilanza
 Do assistuando et ad ogni spirito se benero no solo satisfare
 aluano che nome della Lettera di Mathematici nelle Scu-
 ole di Padoua,

Inuice dauere determinato di presentare al Scipio Principe
 l'Orchiale et il p. essere di Giouamento inestimabile di ogni
 negozio et in circa marittima o terrestre stimo di tenere quel-
 lo nuovo artificio ne l' maggior segreto et solam a disposizione
 di V. Ser.^a L'Orchiale auato dalle piu u. di ite speculazioni di
 prospetua ha l'uantaggio di scoprire Legni et Vele dell' inimico
 di due hore et piu di tempo prima che egli sia sopra noi et distinguendo
 il numero et la qualita de i Vasselli giudicare la sua forte
 pallesirsi alla caccia al combattimento o alla fuga, o pure esser
 nella campagna aperta uedere et particolarmente distinguere ogni suo
 moto et preparatione.

Adi 7. di Gennaio
 Giove si uede u. 4
 Adi 8. u. 5
 Adi 9. u. 6
 Adi 10. u. 7
 Adi 11. u. 8
 Adi 12. u. 9
 Adi 13. u. 10
 Adi 14. u. 11
 Adi 15. u. 12
 Adi 16. u. 13
 Adi 17. u. 14
 Adi 18. u. 15
 Adi 19. u. 16
 Adi 20. u. 17
 Adi 21. u. 18
 Adi 22. u. 19
 Adi 23. u. 20
 Adi 24. u. 21
 Adi 25. u. 22
 Adi 26. u. 23
 Adi 27. u. 24
 Adi 28. u. 25
 Adi 29. u. 26
 Adi 30. u. 27

East		West	
7	* * ○ *	17	* ○
8	○ * * *	18	* ○ *
9	* * ○	19	* ○ * *
10	* * ○	20	* ○ * *
11	* ○ *	21	* ○ * *
12	* ○ *	22	* ○ * *
13	* ○ *	23	* ○ *
14	* ○ *	24	* ○ *
15	○ * * *	25	* ○ *
16	○ * *	26	* ○ *
17	* ○ *	27	* ○ *
		28	* ○ *
		29	* ○ *
		30	* ○ *

SIDEREUS NUNCIUS 75

On the third, at the seventh hour, the stars were arranged in this sequence. The eastern one was 1 minute, 30 seconds from Jupiter; the closest western one 2 minutes; and the other western one was 10 minutes removed from this one. They were absolutely on the same straight line and of equal magnitude.

On the fourth, at the second hour, there were four stars around Jupiter, two to the east and two to the west, and arranged precisely on a straight line, as in the adjoining figure. The easternmost was distant 3 minutes from the next one, while this one was 40 seconds from Jupiter; Jupiter was 4 minutes from the nearest western one, and this one 6 minutes from the westernmost one. Their magnitudes were nearly equal; the one closest to Jupiter appeared a little smaller than the rest. But at the seventh hour the eastern stars were only 30 seconds apart. Jupiter was 2 minutes from the nearer eastern one, while he was 4 minutes from the next western one, and this one was 3 minutes from the westernmost one. They were all equal and extended on the same straight line along the ecliptic.

On the fifth, the sky was cloudy.

On the sixth, only two stars appeared flanking Jupiter, as is seen in the adjoining figure. The eastern one was 2 minutes and the western one 3 minutes from Jupiter. They were on the same straight line with Jupiter and equal in magnitude.

On the seventh, two stars stood near Jupiter, both to the east, arranged in this manner.

Notes for & re-productions of Siderius Nuncius

WorldWide Telescope: Explaining Galileo's Discovery

GALILEO'S "NEW ORDER"

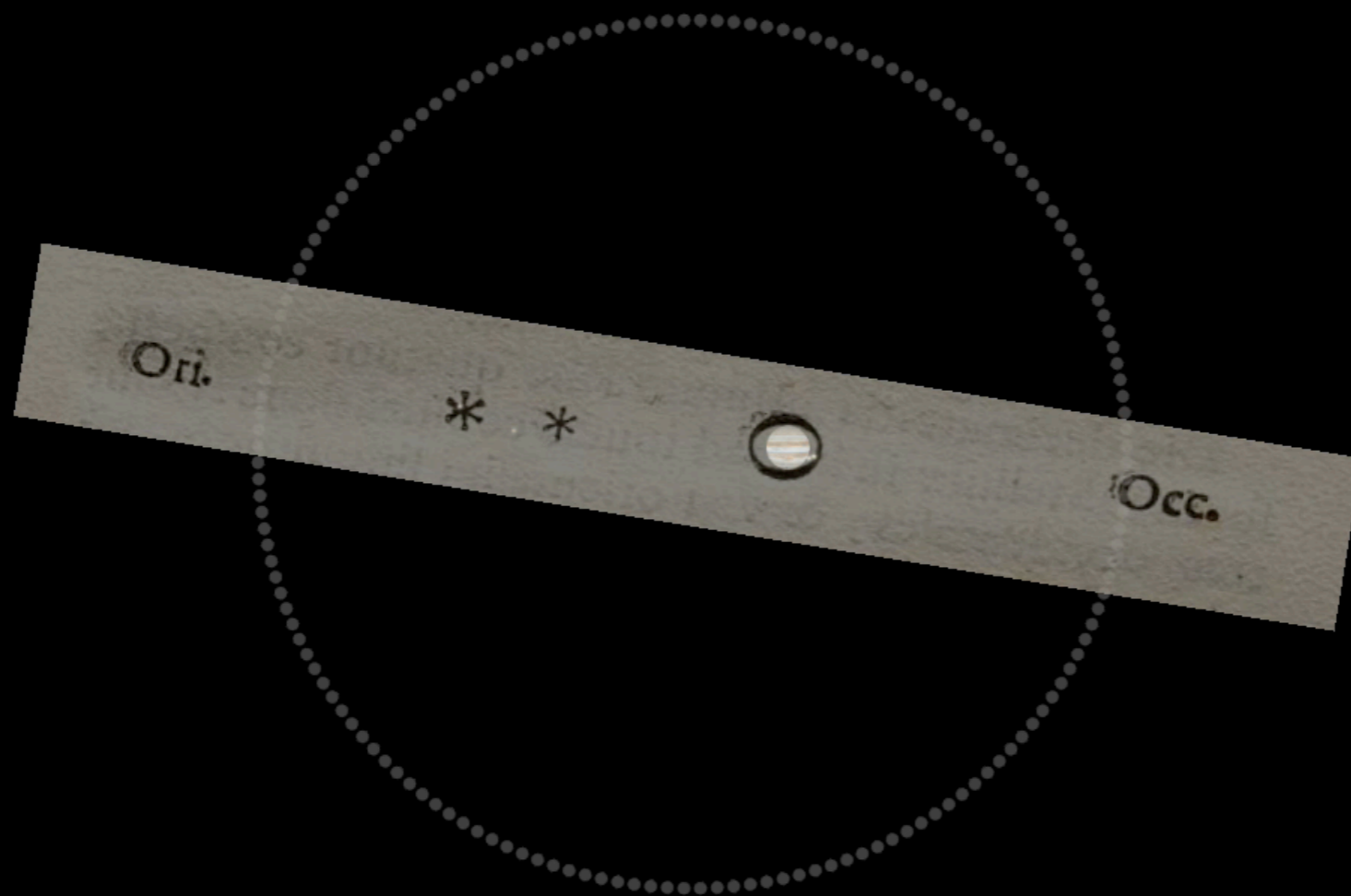
Created by Alyssa Goodman, Curtis Wong and Pat Udomprasert,
with advice from Owen Gingerich and David Malin



Galileo's New Order, A WorldWide Telescope Tour by Goodman, Wong & Udomprasert 2010
WWT Software Wong (inventor, MS Research), Fay (architect, MS Research), et al., now open source, hosted by AAS
see wwtambassadors.org for more on WWT Outreach

WorldWide Telescope: Explaining Galileo's Discovery


January 11, 1610




Galileo's New Order, A WorldWide Telescope Tour by Goodman, Wong & Udomprasert 2010
WWT Software Wong (inventor, MS Research), Fay (architect, MS Research), et al., now open source, hosted by AAS
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WorldWide Telescope: Exploring the Universe

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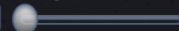
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2009/07/29 06:01:17 X 10000 : Paused Galactic Plane Mode  Now


Layers

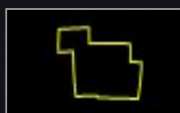
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 - Mercury
 - Venus
 - Earth
 - Mars
 - Jupiter
 - Saturn
 - Uranus
 - Neptune
 - Pluto
- Sky
 - Overlays
 - Constellations
 - Constellation Pictures
 - Constellation Figures
 - Constellation Boundaries
 - Constellation Names
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 - AltAz Grid
 - Ecliptic Grid
 - Ecliptic Overview
 - Precession Chart
 - 2d Sky

Time Scrubber

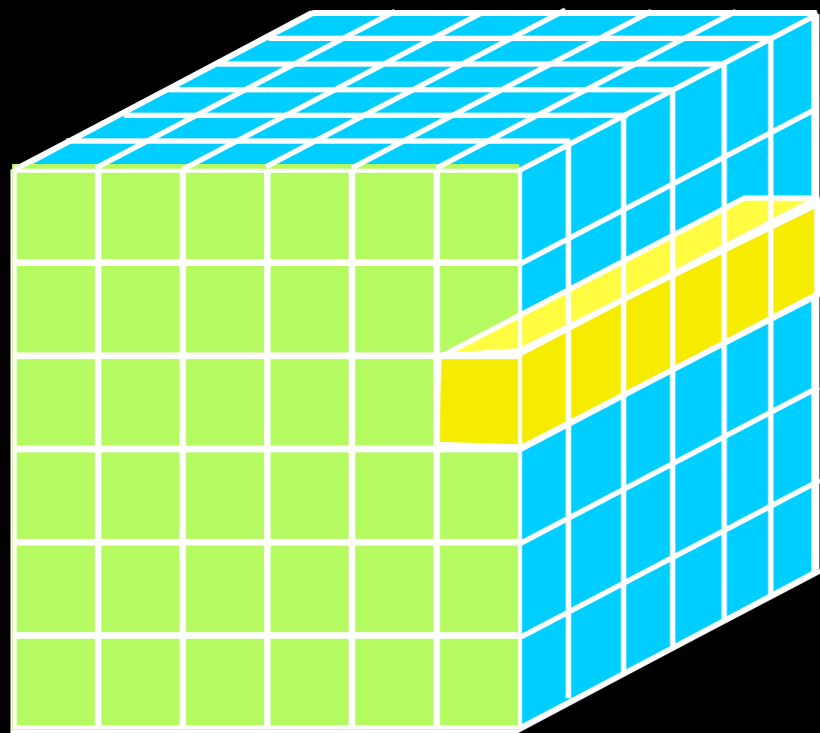
Look At: Sky Imagery: Digitized Sky Survey (Color) Image Crossfade: 

 WorldWide Telescope

Tracking SFD Dust Map (Infrared) 

RA: 16h26m05s Dec: -25:20:17  Cetus 14:56:51

[demo]



Data, Dimensions, Display

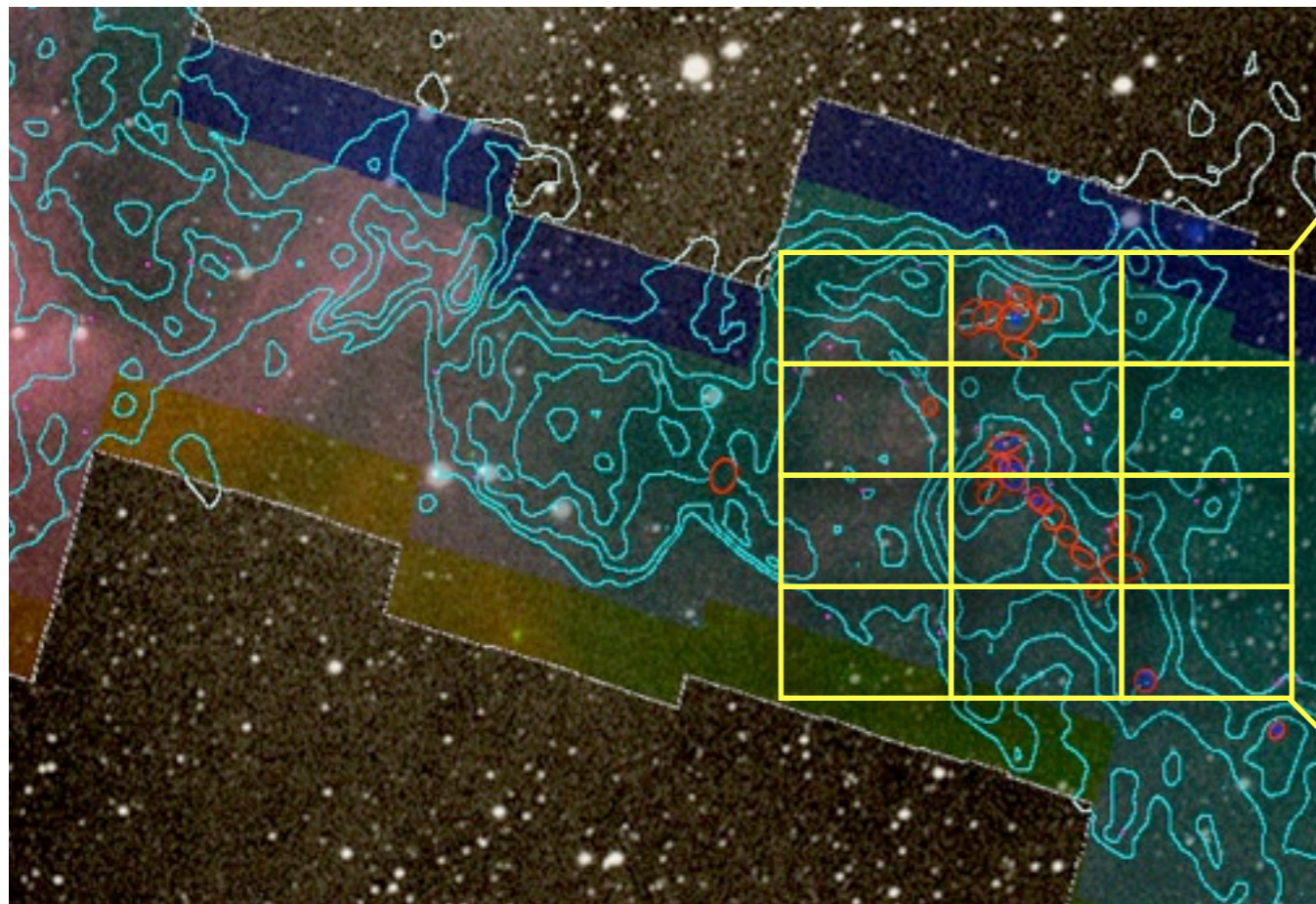
1D: Columns = "Spectra", "SEDs" or "Time Series"

2D: Faces or Slices = "Images"

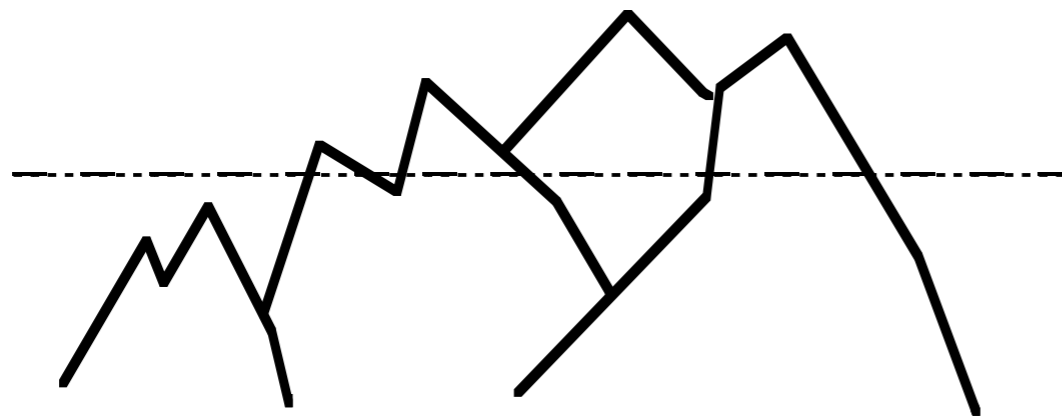
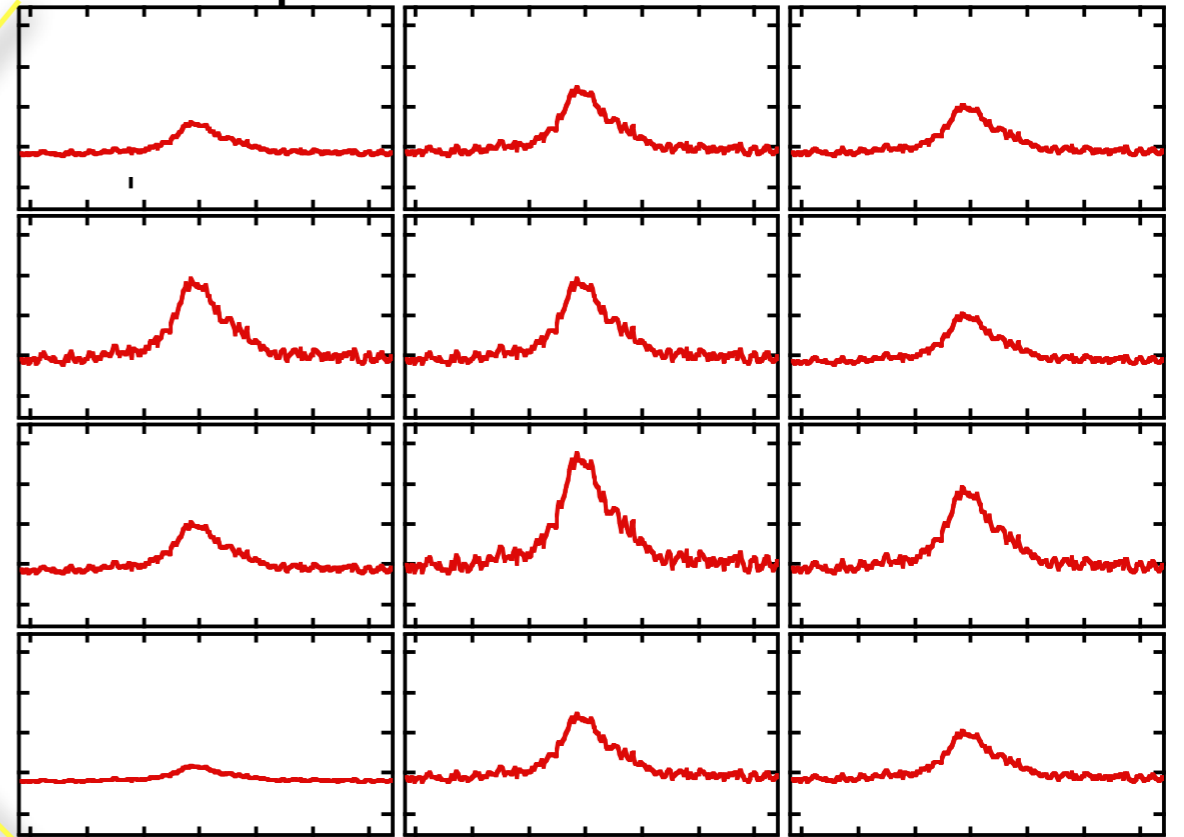
3D: Volumes = "3D Renderings", "2D Movies"

4D: Time Series of Volumes = "3D Movies"

Data, Dimensions, Display



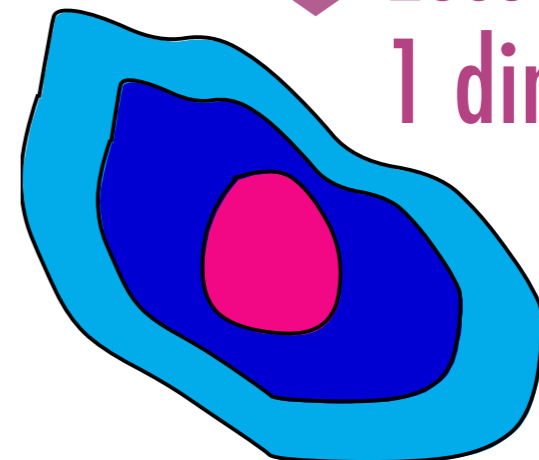
Spectral Line Observations



Mountain Range








No loss of information

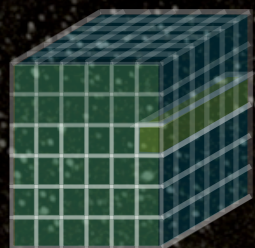


Loss of 1 dimension

Data, Dimensions, Display

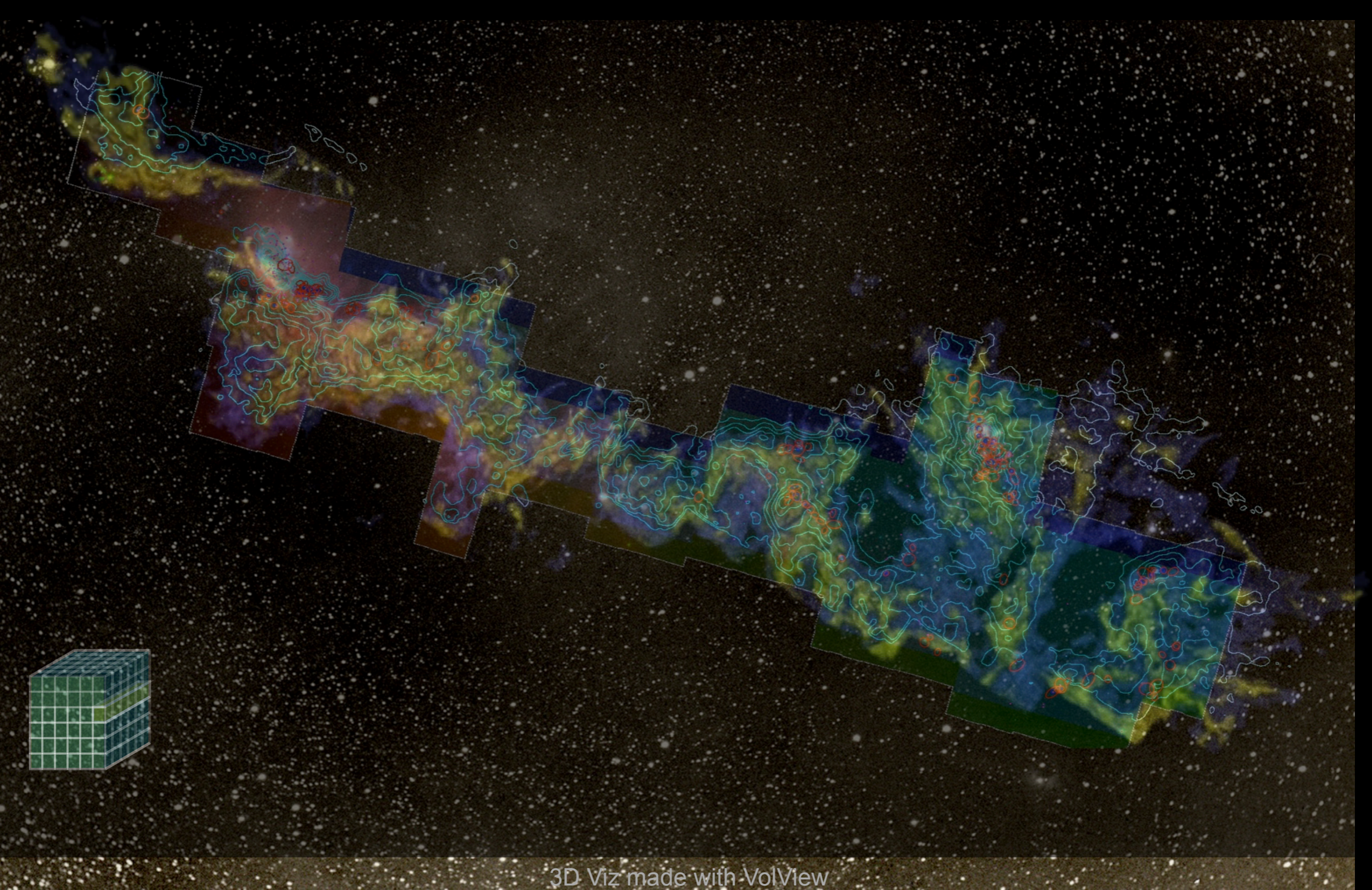
W/L: 63 WW: 127

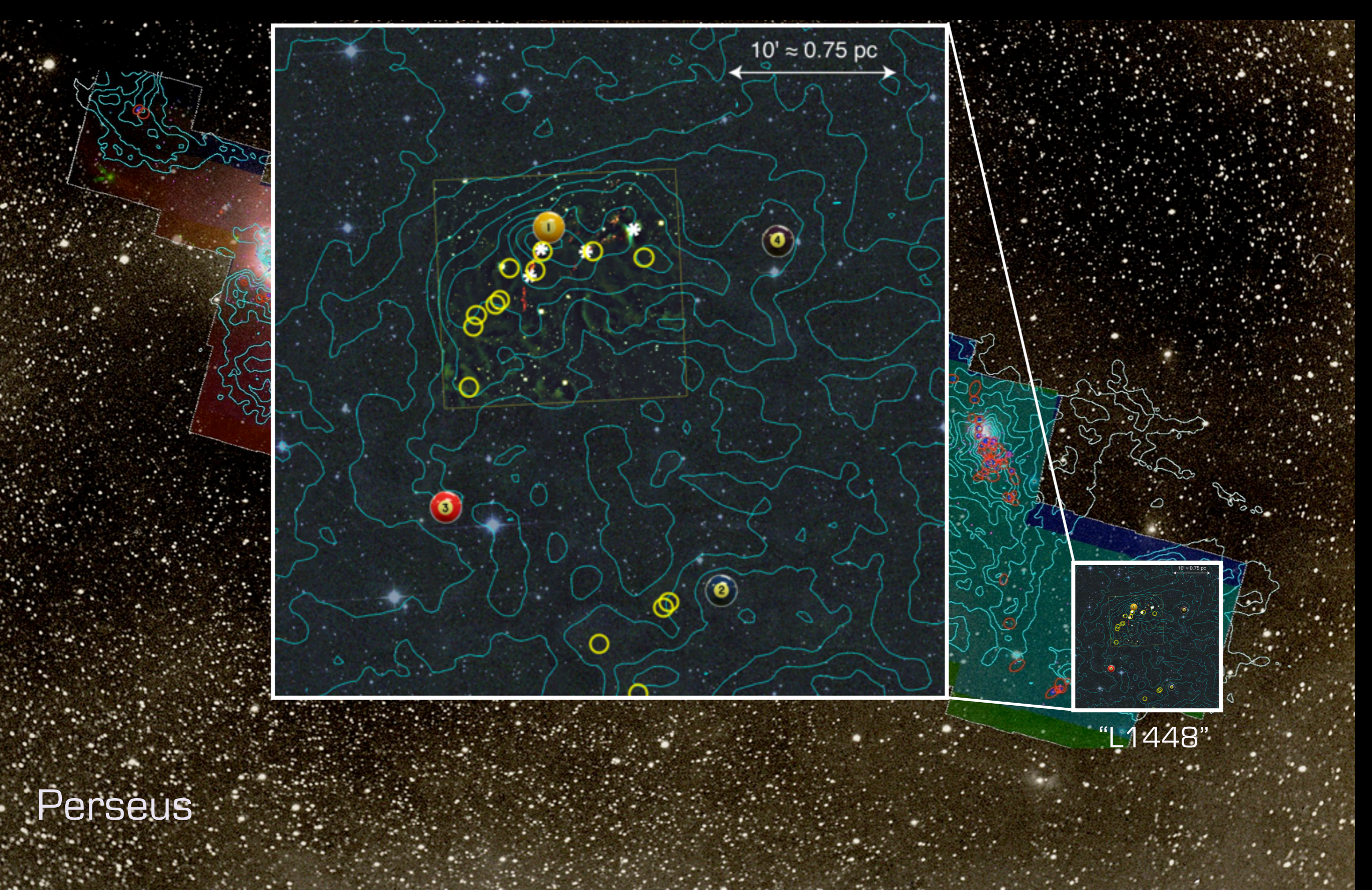
-  mm peak (Enoch et al. 2006)
-  sub-mm peak (Hatchell et al. 2005, Kirk et al. 2006)
-  ^{13}CO (Ridge et al. 2006)
-  mid-IR IRAC composite from c2d data (Foster, Laakso, Ridge, et al.)
-  Optical image (Barnard 1927)



m: 1/249
Zoom: 227% Angle: 0







Perseus

“3D PDF” (Nature, 2009)

1 / 4 131% Tools Comment Share

Vol 457 | 1 January 2009 | doi:10.1038/nature07609 nature


LETTERS

A role for self-gravity at multiple length scales in the process of star formation

Alyssa A. Goodman^{1,2}, Erik W. Rosolowsky^{2,3}, Michelle A. Borkin^{1†}, Jonathan B. Foster², Michael Halle^{1,4}, Jens Kauffmann^{1,2} & Jaime E. Pineda²

Self-gravity plays a decisive role in the final stages of star formation, where dense cores (size ~ 0.1 parsecs) inside molecular clouds collapse to form star-plus-disk systems¹. But self-gravity's role at earlier times (and on larger length scales, such as ~ 1 parsec) is unclear; some molecular cloud simulations that do not include self-gravity suggest that 'turbulent fragmentation' alone is sufficient to create a mass distribution of dense cores that resembles, and sets, the stellar initial mass function². Here we report a 'dendrogram' (hierarchical tree-diagram) analysis that reveals that self-gravity plays a significant role over the full range of possible scales traced by ¹³CO observations in the L1448 molecular cloud, but not everywhere in the observed region. In particular, more than 90 per cent of the compact 'pre-stellar cores' traced by peaks of dust emission³ are projected on the sky within one of the dendrogram's self-gravitating 'leaves'. As these peaks mark the locations of already-forming stars, or of those probably about to form, a self-gravitating cocoon seems a critical condition for their exist-

overlapping features as an option, significant emission found between prominent clumps is typically either appended to the nearest clump or turned into a small, usually 'pathological', feature needed to encompass all the emission being modelled. When applied to molecular-line



The image shows a field of stars with a dendrogram overlaid, representing hierarchical clustering of emission features. A scale bar at the top left indicates $10' \approx 0.75 \text{ pc}$. A yellow box highlights a specific region of the dendrogram.

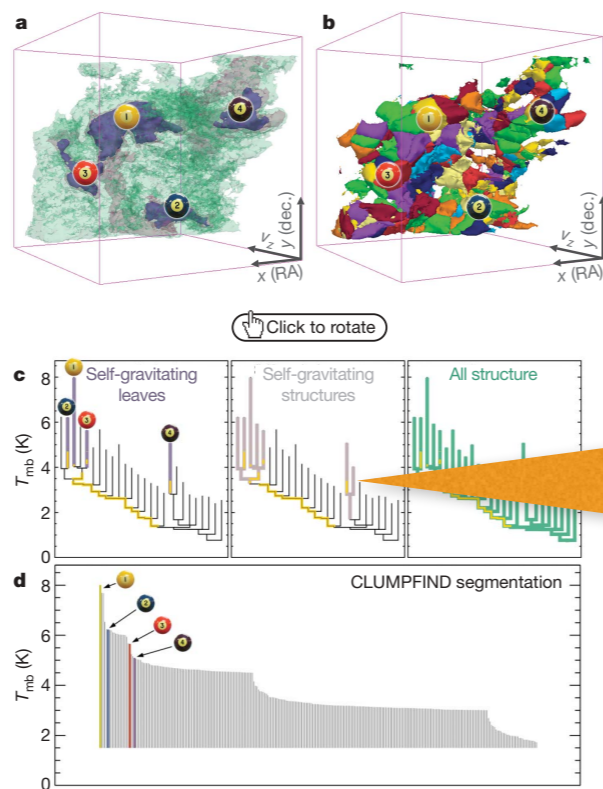


Figure 2 | Comparison of the 'dendrogram' and 'CLUMPFIND' feature-identification algorithms as applied to ^{13}CO emission from the L1448 region of Perseus. **a**, 3D visualization of the surfaces indicated by colours in the dendrogram shown in **c**. Purple illustrates the smallest scale self-gravitating structures in the region corresponding to the leaves of the dendrogram; pink shows the smallest surfaces that contain distinct self-gravitating leaves within them; and green corresponds to the surface in the data cube containing all the significant emission. Dendrogram branches corresponding to self-gravitating objects have been highlighted in yellow over the range of T_{mb} (main-beam temperature) test-level values for which the virial parameter is less than 2. The x - y locations of the four 'self-gravitating' leaves labelled with billiard balls are the same as those shown in Fig. 1. The 3D visualizations show position-position-velocity (p - p - v) space. RA, right ascension; dec., declination. For comparison with the ability of dendrograms (**c**) to track hierarchical structure, **d** shows a pseudo-dendrogram of the CLUMPFIND segmentation (**b**), with the same four labels used in Fig. 1 and in **a**. As 'clumps' are not allowed to belong to larger structures, each pseudo-branch in **d** is simply a series of lines connecting the maximum emission value in each clump to the threshold value. A very large number of clumps appears in **b** because of the sensitivity of CLUMPFIND to noise and small-scale structure in the data. In the online PDF version, the 3D cubes (**a** and **b**) can be rotated to any orientation, and surfaces can be turned on and off (interaction requires Adobe Acrobat version 7.0.8 or higher). In the printed version, the front face of each 3D cube (the 'home' view in the interactive online version) corresponds exactly to the patch of sky shown in Fig. 1, and velocity with respect to the Local Standard of Rest increases from front (-0.5 km s^{-1}) to back (8 km s^{-1}).

data, CLUMPFIND typically finds features on a limited range of scales, above but close to the physical resolution of the data, and its results can be overly dependent on input parameters. By tuning CLUMPFIND's two free parameters, the same molecular-line data set⁸ can be used to show either that the frequency distribution of clump mass is the same as the initial mass function of stars or that it follows the much shallower mass function associated with large-scale molecular clouds (Supplementary Fig. 1).

Four years before the advent of CLUMPFIND, 'structure trees'⁹ were proposed as a way to characterize clouds' hierarchical structure

using 2D maps of column density. With this previous 2D work as inspiration, we have developed a structure-identification algorithm that abstracts the hierarchical structure of a data set into an easily visualized representation called a dendrogram, which has been well developed in other data-intensive fields. The application of tree methodologies so far has been almost exclusively within the area of astronomy, and 'merger trees' are being used with increasing frequency. Figure 3 and its legend explain the dendrogram process schematically. The dendrogram can be used to estimate the role of self-gravity at each point in the hierarchy, via calculation of an 'observed' virial parameter, $\alpha_{\text{obs}} = 5\sigma_v^2 R / GM_{\text{lum}}$. In principle, extended portions of the tree (Fig. 2, yellow highlighting) where $\alpha_{\text{obs}} < 2$ (where gravitational energy is comparable to or larger than kinetic energy) correspond to regions of p - p - v space where self-gravity is significant. As α_{obs} only represents the ratio of kinetic energy to gravitational energy at one point in time, and does not explicitly capture external over-pressure and/or magnetic fields¹⁶, its measured value should only be used as a guide to the longevity (boundedness) of any particular feature.

These are "dead" panels! That's not good enough.

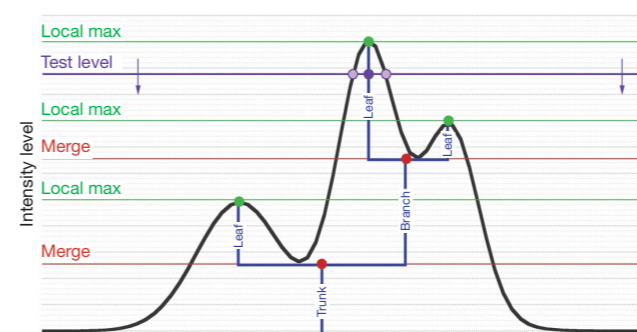


Figure 3 | Schematic illustration of the dendrogram process. Shown is the construction of a dendrogram from a hypothetical one-dimensional emission profile (black). The dendrogram (blue) can be constructed by 'dropping' a test constant emission level (purple) from above in tiny steps (exaggerated in size here, light lines) until all the local maxima and mergers are found, and connected as shown. The intersection of a test level with the emission is a set of points (for example the light purple dots) in one dimension, a planar curve in two dimensions, and an isosurface in three dimensions. The dendrogram of 3D data shown in Fig. 2c is the direct analogue of the tree shown here, only constructed from 'isosurface' rather than 'point' intersections. It has been sorted and flattened for representation on a flat page, as fully representing dendrograms for 3D data cubes would require four dimensions.

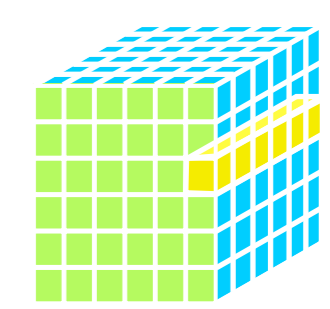
A role for self-gravity at multiple length scales in the star formation

Ark W. Rosolowsky^{1,2}, Michelle A. Borkin^{1†}, Jonathan B. Foster², Michael Halle^{1,4}, and E. Pineda²

In the final stages of star formation (protostars) inside molecular clouds... But self-gravity's role at multiple scales, such as ~ 1 parsec, is... fragmentation' alone is sufficient'. Here we report a 'density analysis' that reveals that the full range of possible... the 1.148 molecular cloud... 'trunk' traced by peaks... within one of the dense... peaks mark the loca...



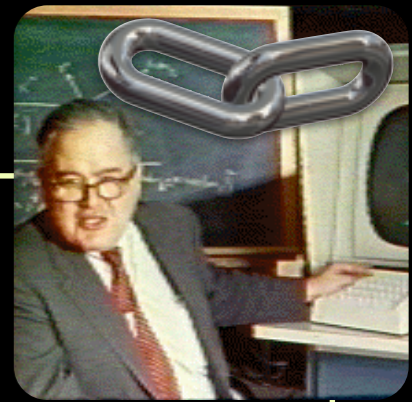
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3D PDF



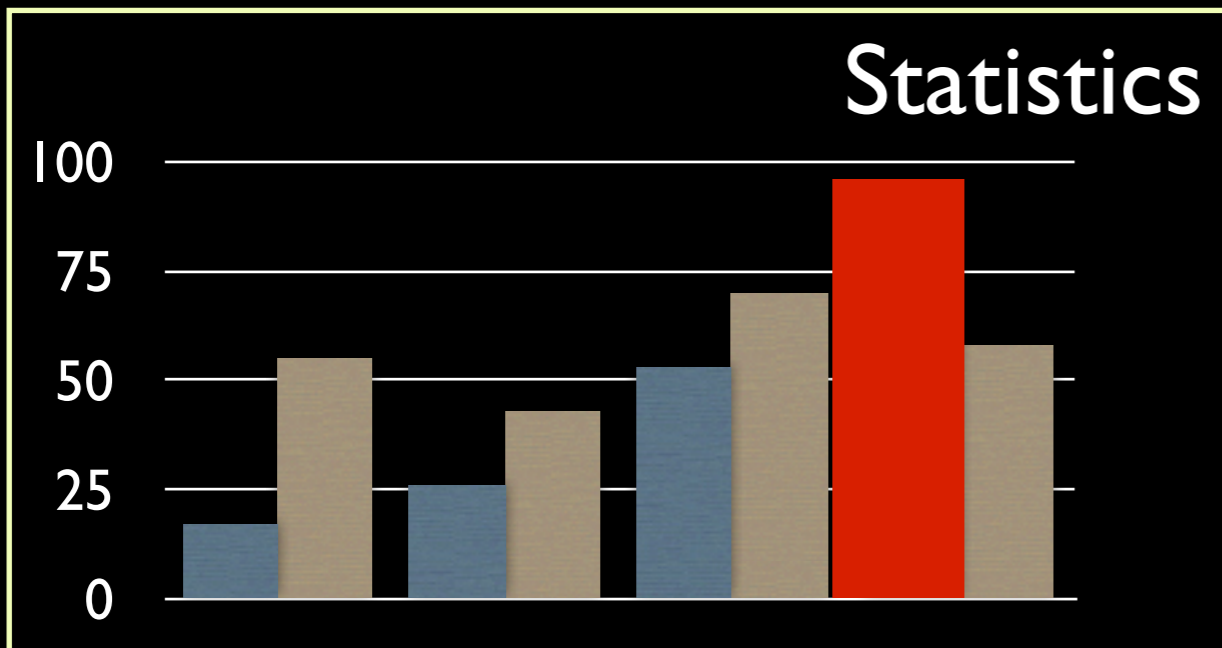
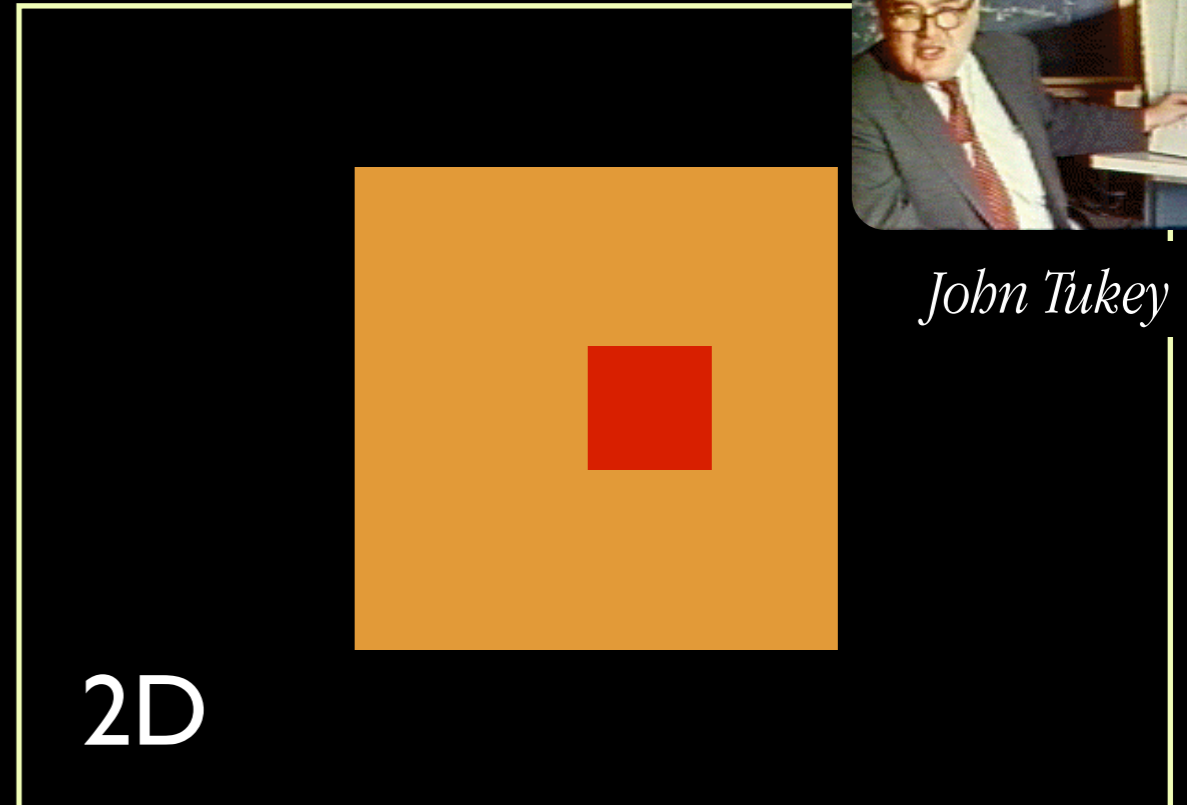
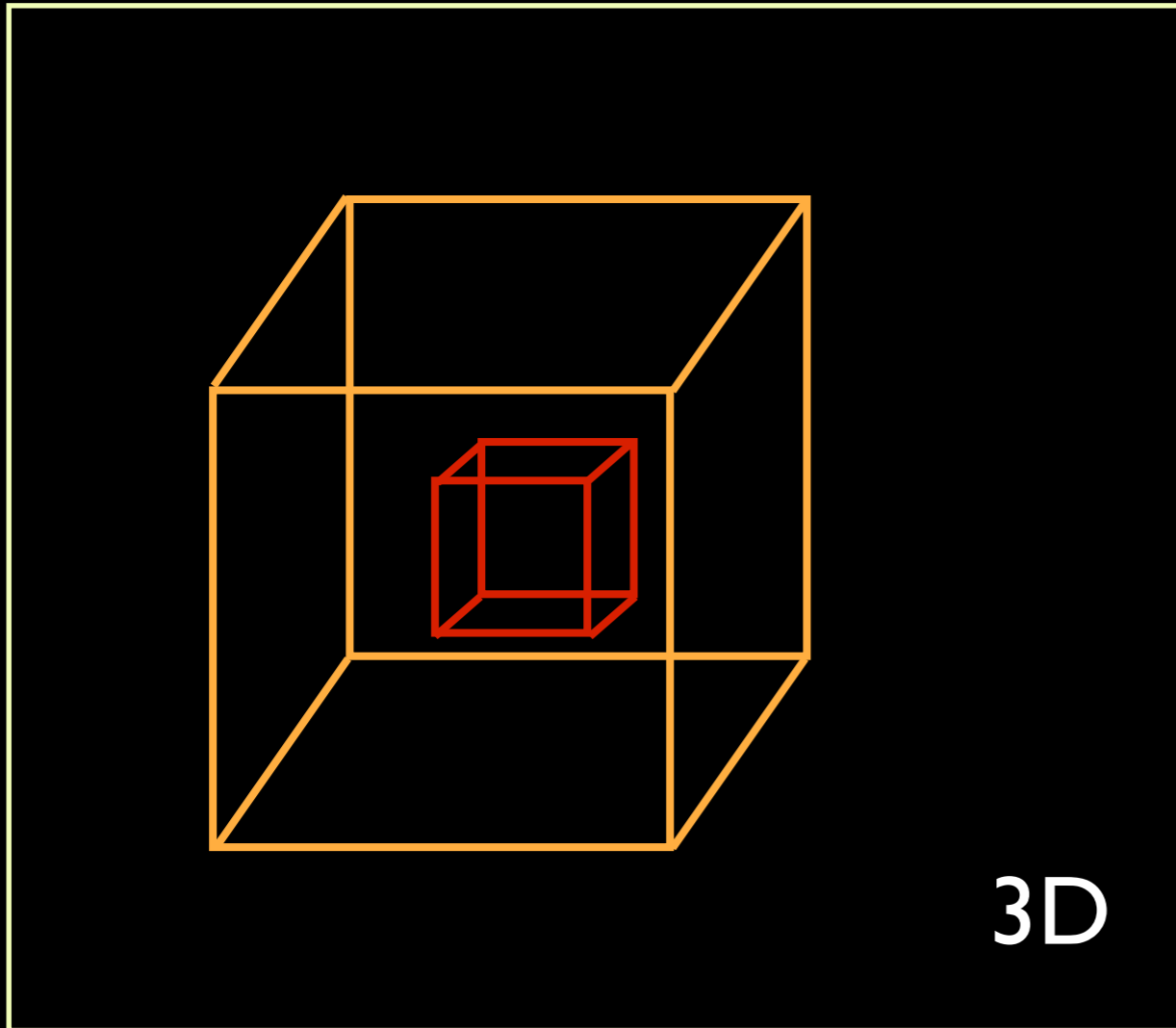
Goodman et al. 2009, Nature, cf: Fluke et al. 2009

VAST

Linked Views of High-dimensional Data



John Tukey

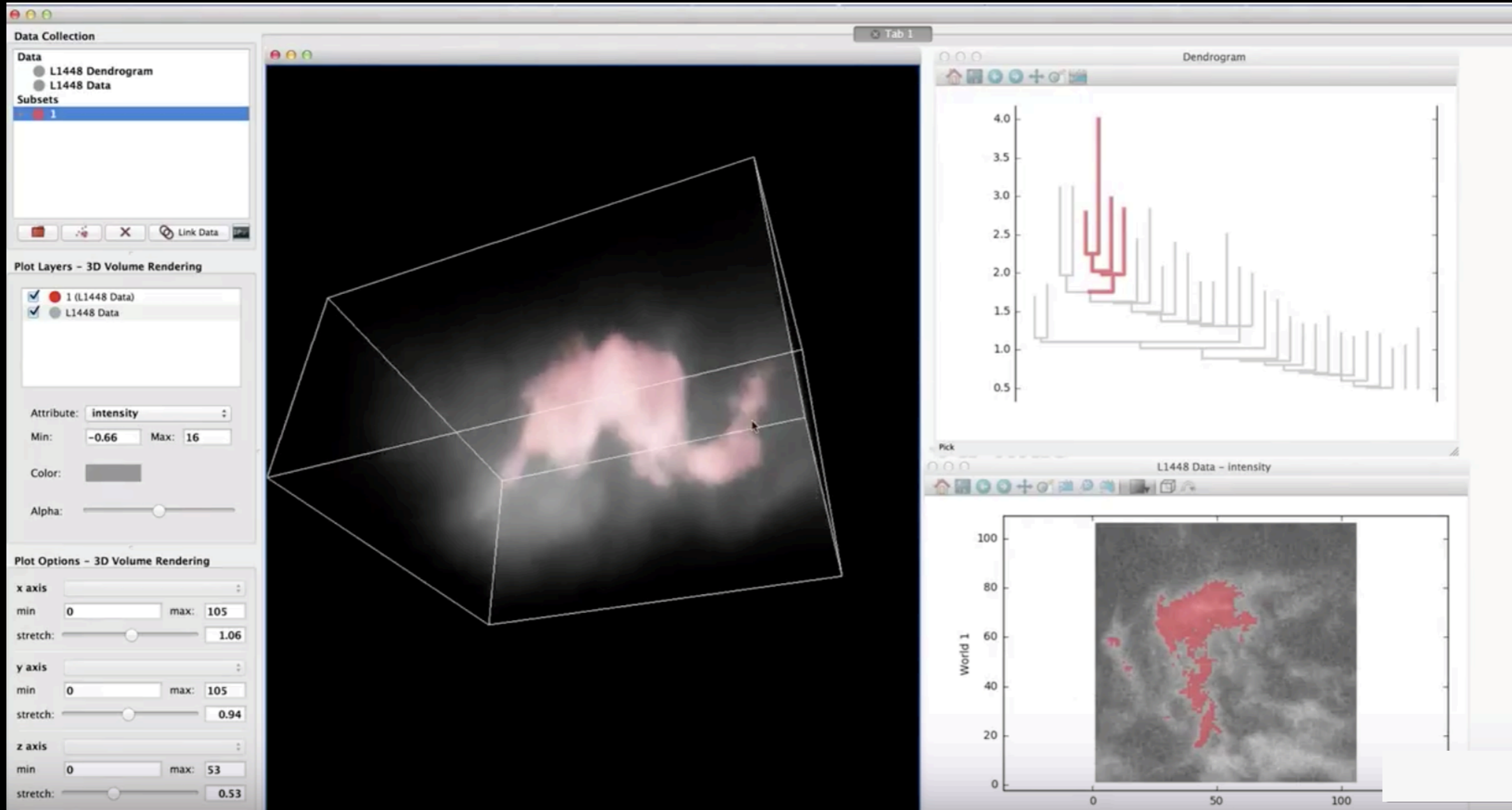


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Data Collection

Data

- L1448 Dendrogram
- L1448 Data

Subsets

- 1

Plot Layers - 3D Volume Rendering

- 1 (L1448 Data)
- L1448 Data

Attribute: intensity

Min: -0.66 Max: 16

Color: [Color swatch]

Alpha: [Slider]

Plot Options - 3D Volume Rendering

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stretch: 1.06

y axis

min 0 max: 105

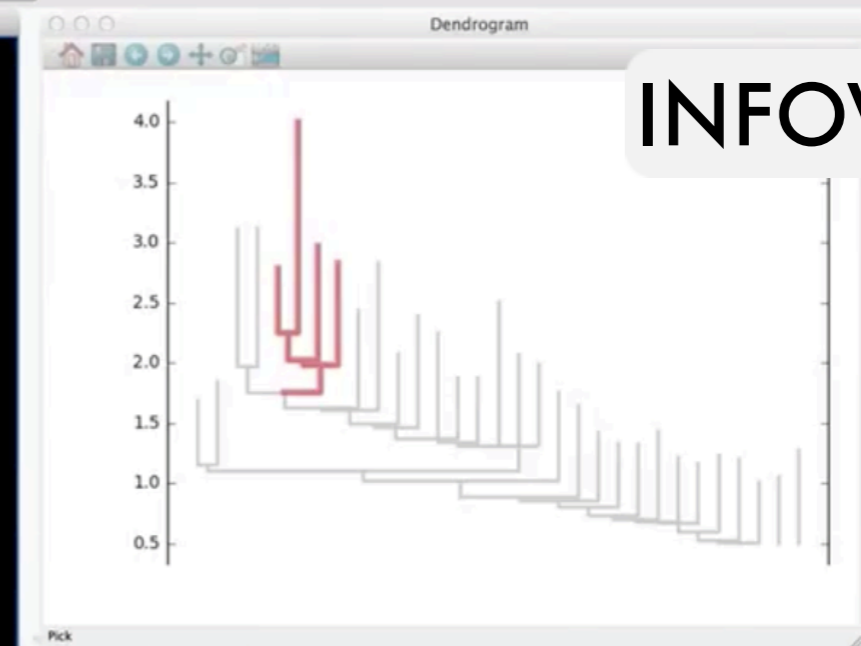
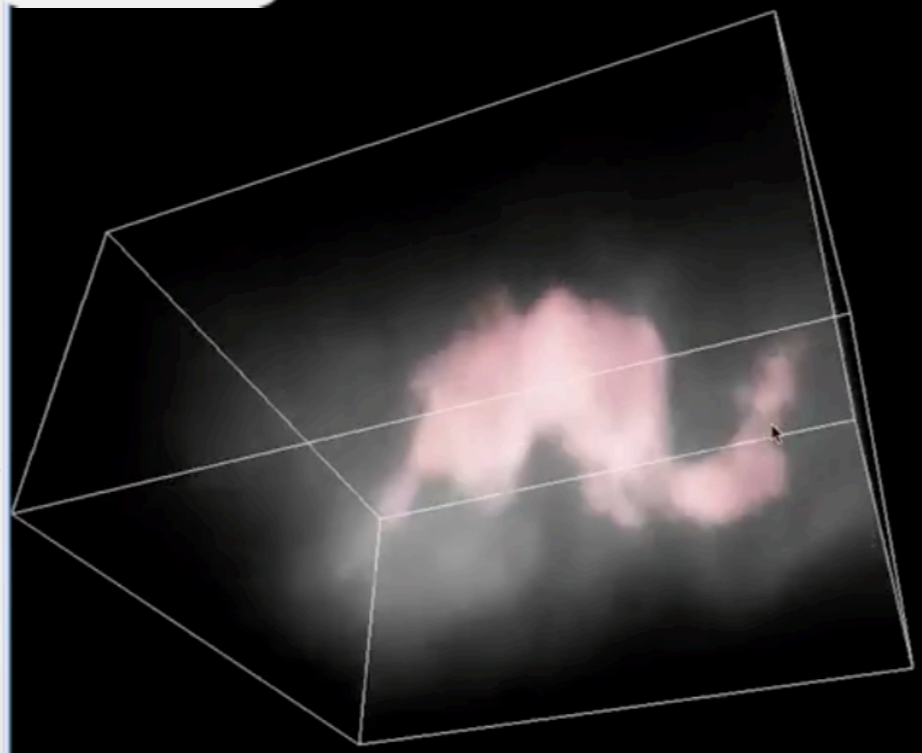
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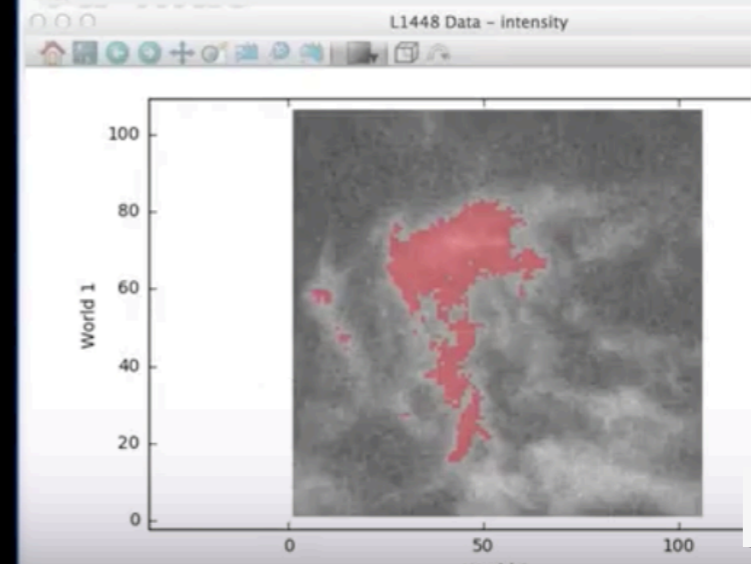
min 0 max: 53

stretch: 0.53

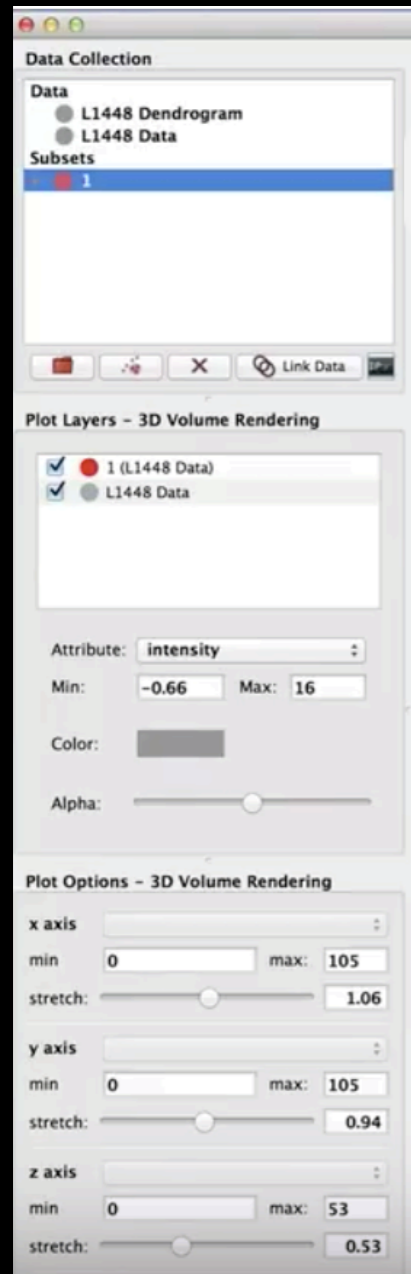
SCIVIS



INFOVIS

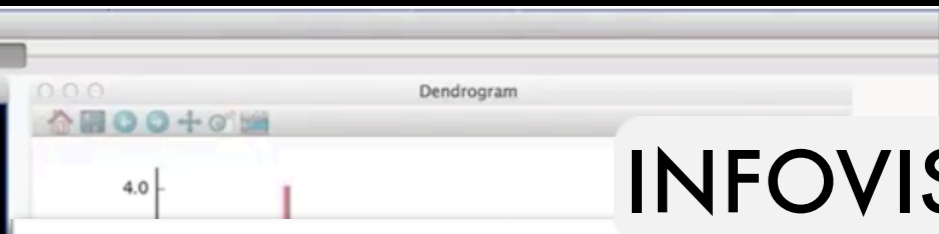


VAST



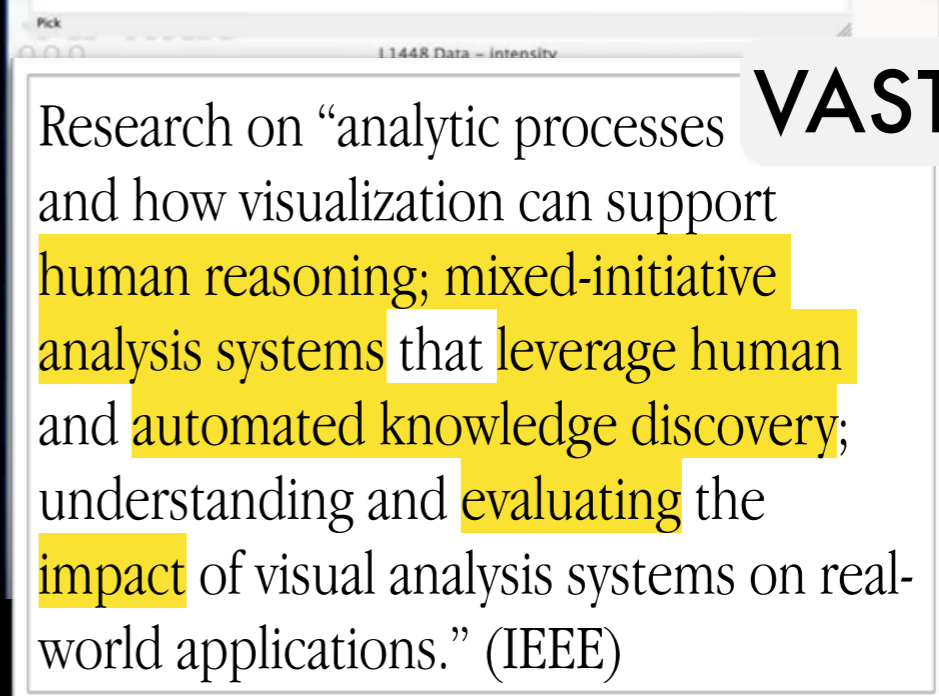
SCIVIS

Research “primarily concerned with the visualization of three-dimensional phenomena (architectural, meteorological, medical, biological, etc.), where the emphasis is on realistic renderings of volumes, surfaces, illumination sources, and so forth, perhaps with a dynamic(time) component”. (Wikipedia)



INFOVIS

Research on “human visual data exploration, analysis, and communication within displays that flexibly encode data in perceptually effective ways.” (IEEE)



VAST

Research on “analytic processes and how visualization can support human reasoning; mixed-initiative analysis systems that leverage human and automated knowledge discovery; understanding and evaluating the impact of visual analysis systems on real-world applications.” (IEEE)

VAST • INFOVIS • SCIVIS

VIS

2018

21–26 October 2018
BERLIN, GERMANY



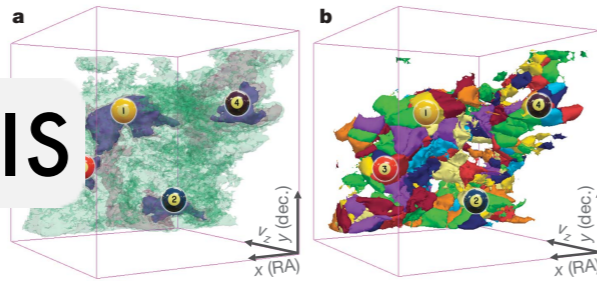
The screenshot displays the glue interface with three main views:

- SCIVIS:** A 3D volume rendering of a pink, abstract shape within a wireframe box. The left sidebar shows 'Data Collection' with 'L1448 Dendrogram' and 'L1448 Data' selected, and 'Plot Layers - 3D Volume Rendering' with '1 (L1448 Data)' and 'L1448 Data' checked. The 'Attribute' is set to 'intensity' with a range from -0.66 to 16. The 'Plot Options - 3D Volume Rendering' section shows axis settings: x-axis (min: 0, max: 105, stretch: 1.06), y-axis (min: 0, max: 105, stretch: 0.94), and z-axis (min: 0, max: 53, stretch: 0.53).
- INFOVIS:** A 'Dendrogram' plot showing hierarchical clustering of data points, with a vertical axis ranging from 2.0 to 4.0.
- VAST:** A 'World 1' plot showing a map of the world with a red region highlighted, and a vertical axis ranging from 0 to 80.

The 'glue' logo, featuring a grid of icons and the text 'glue multidimensional data exploration', is centered over the interface.

core glue contributors: C. Beaumont, M. Borkin, M. Breddels, A. Goodman, T. Robitaille

SCIVIS



INFOVIS

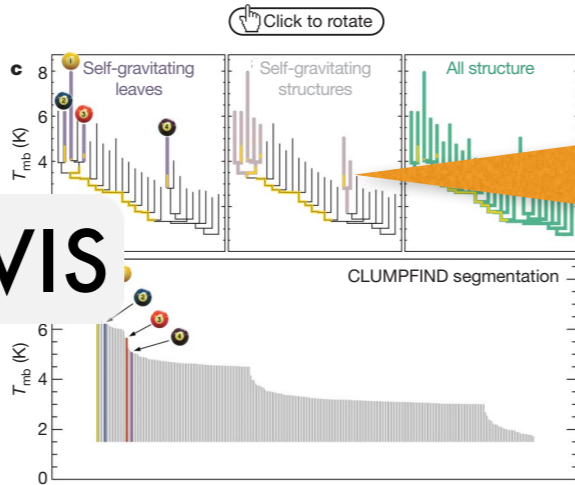


Figure 2 | Comparison of the 'dendrogram' and 'CLUMPFIND' feature-identification algorithms as applied to ¹³CO emission from the L1448 region of Perseus. **a**, 3D visualization of the surfaces indicated by colours in the dendrogram shown in **c**. Purple illustrates the smallest scale self-gravitating structures in the region corresponding to the leaves of the dendrogram; pink shows the smallest surfaces that contain distinct self-gravitating leaves within them; and green corresponds to the surface in the data cube containing all the significant emission. Dendrogram branches corresponding to self-gravitating objects have been highlighted in yellow over the range of T_{mb} (main-beam temperature) test-level values for which the virial parameter is less than 2. The x - y locations of the four 'self-gravitating' leaves labelled with billiard balls are the same as those shown in Fig. 1. The 3D visualizations show position-position-velocity (p - p - v) space. RA, right ascension; dec., declination. For comparison with the ability of dendrograms (**c**) to track hierarchical structure, **d** shows a pseudo-dendrogram of the CLUMPFIND segmentation (**b**), with the same four labels used in Fig. 1 and in **a**. As 'clumps' are not allowed to belong to larger structures, each pseudo-branch in **d** is simply a series of lines connecting the maximum emission value in each clump to the threshold value. A very large number of clumps appears in **b** because of the sensitivity of CLUMPFIND to noise and small-scale structure in the data. In the online PDF version, the 3D cubes (**a** and **b**) can be rotated to any orientation, and surfaces can be turned on and off (interaction requires Adobe Acrobat version 7.0.8 or higher). In the printed version, the front face of each 3D cube (the 'home' view in the interactive online version) corresponds exactly to the patch of sky shown in Fig. 1, and velocity with respect to the Local Standard of Rest increases from front (-0.5 km s^{-1}) to back (8 km s^{-1}).

data, CLUMPFIND typically finds features on a limited range of scales, above but close to the physical resolution of the data, and its results can be overly dependent on input parameters. By tuning CLUMPFIND's two free parameters, the same molecular-line data set⁸ can be used to show either that the frequency distribution of clump mass is the same as the initial mass function of stars or that it follows the much shallower mass function associated with large-scale molecular clouds (Supplementary Fig. 1).

Four years before the advent of CLUMPFIND, 'structure trees'⁹ proposed as a way to characterize clouds' hierarchical structure

using 2D maps of column density. With this and previous 2D work as inspiration, we have developed a structure-identification algorithm that abstracts the hierarchical structure of a data set into an easily visualized representation called a dendrogram. Well developed in other data-intensive fields, the application of tree methodologies so far has been almost exclusively within the area of astronomy. 'merger trees' are being used with increasing frequency. Figure 3 and its legend explain the dendrogram process schematically. The dendrogram can be used to estimate the role of self-gravity at each point in the hierarchy, via calculation of an 'observed' virial parameter, $\alpha_{obs} = 5\sigma_v^2 R / GM_{lum}$. In principle, extended portions of the tree (Fig. 2, yellow highlighting) where $\alpha_{obs} < 2$ (where gravitational energy is comparable to or larger than kinetic energy) correspond to regions of p - p - v space where self-gravity is significant. As α_{obs} only represents the ratio of kinetic energy to gravitational energy at one point in time, and does not explicitly capture external over-pressure and/or magnetic fields¹⁶, its measured value should only be used as a guide to the longevity (boundedness) of any particular feature.

These are "dead" panels! That's not good enough.

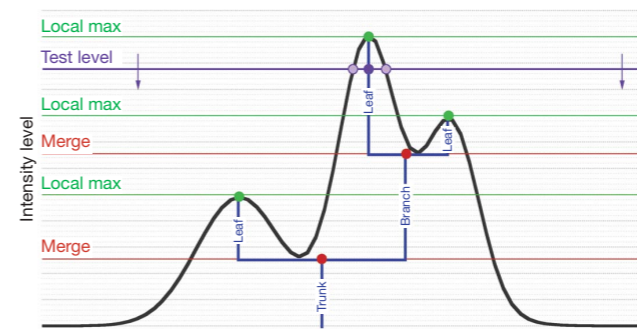
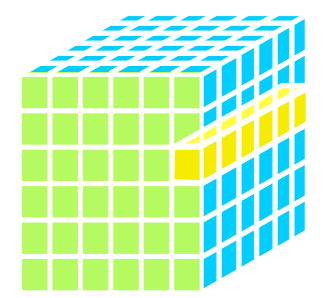


Figure 3 | Schematic illustration of the dendrogram process. Shown is the construction of a dendrogram from a hypothetical one-dimensional emission profile (black). The dendrogram (blue) can be constructed by 'dropping' a test constant emission level (purple) from above in tiny steps (exaggerated in size here, light lines) until all the local maxima and mergers are found, and connected as shown. The intersection of a test level with the emission is a set of points (for example the light purple dots) in one dimension, a planar curve in two dimensions, and an isosurface in three dimensions. The dendrogram of 3D data shown in Fig. 2c is the direct analogue of the tree shown here, only constructed from 'isosurface' rather than 'point' intersections. It has been sorted and flattened for representation on a flat page, as fully representing dendrograms for 3D data cubes would require four dimensions.



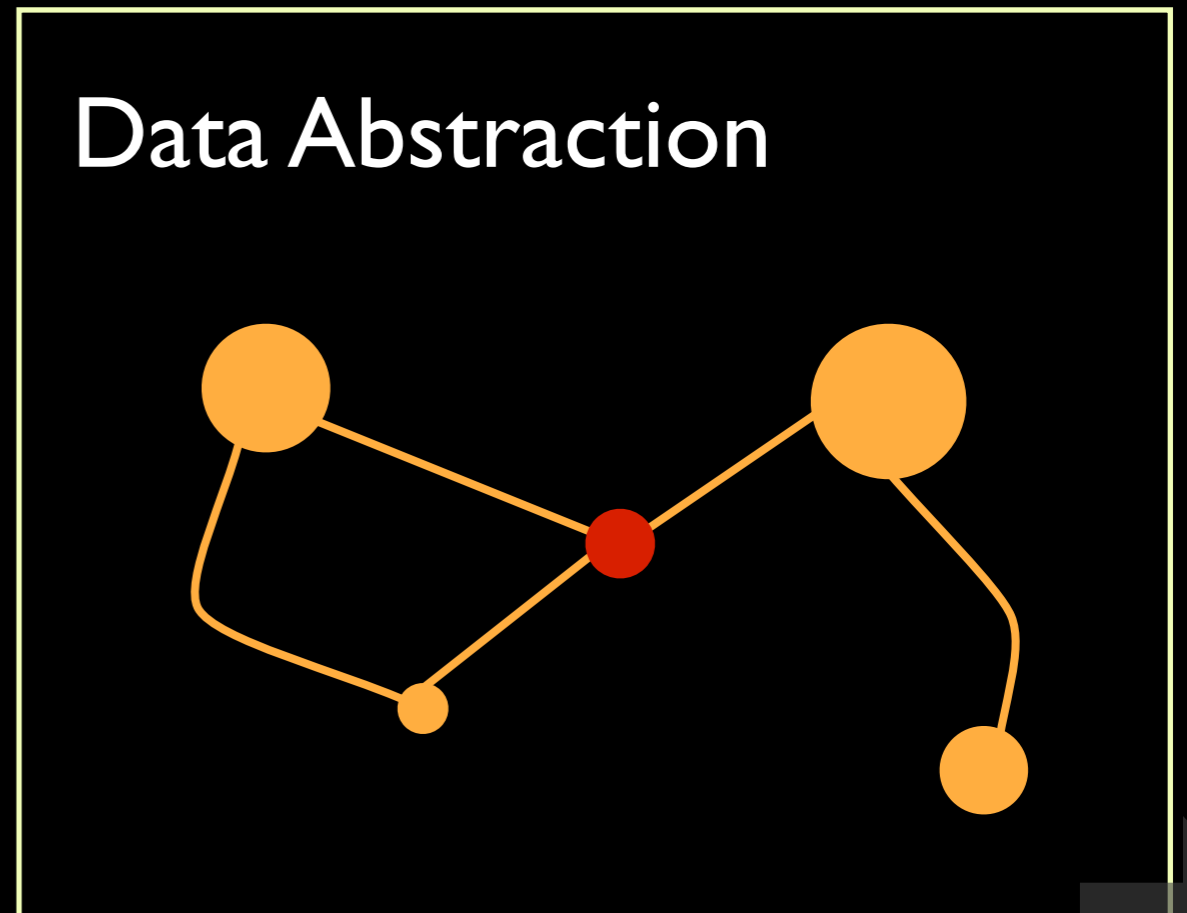
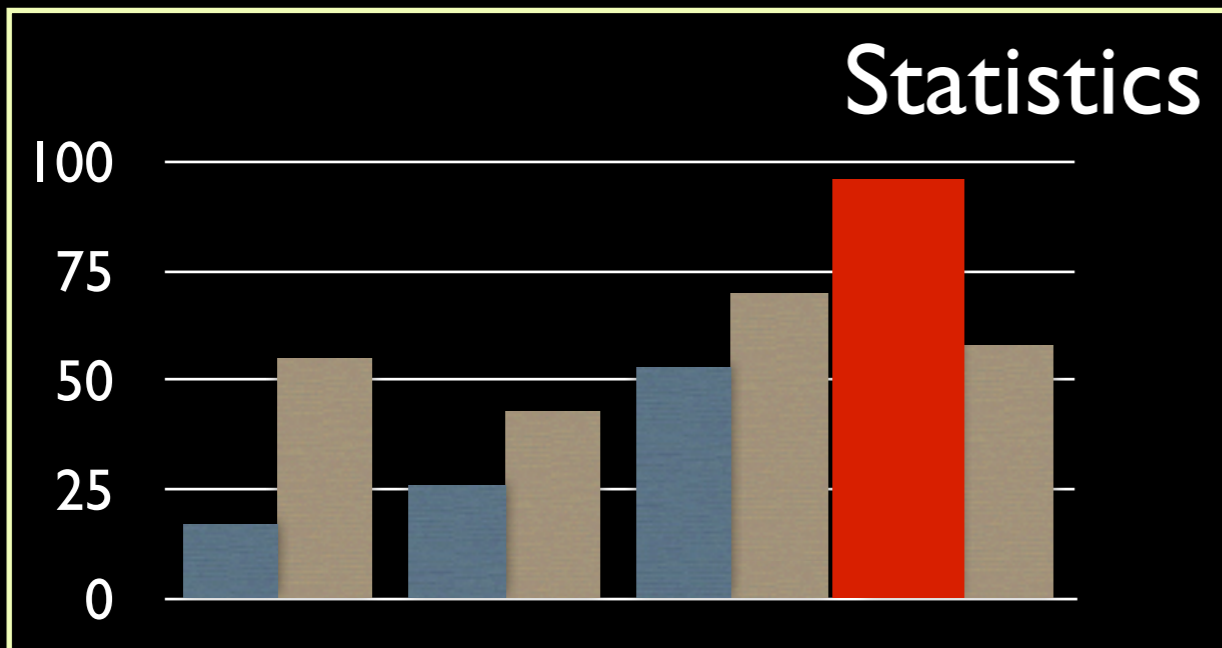
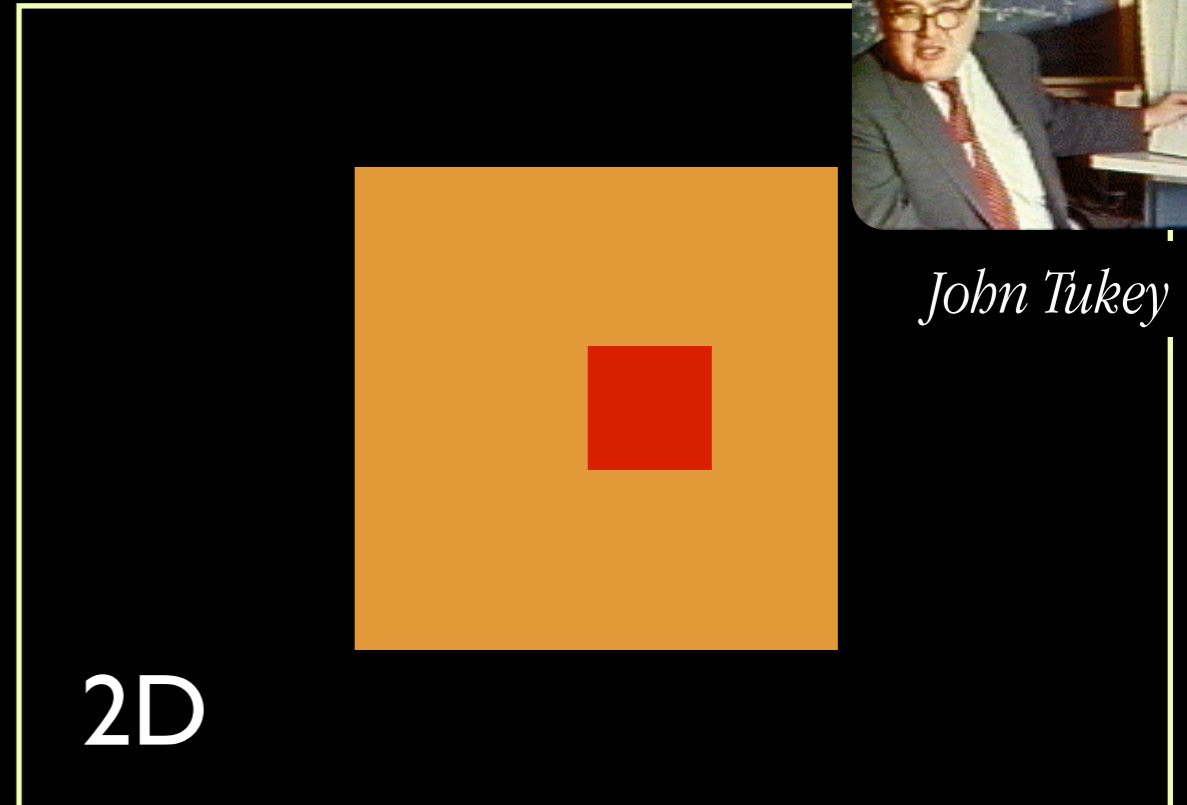
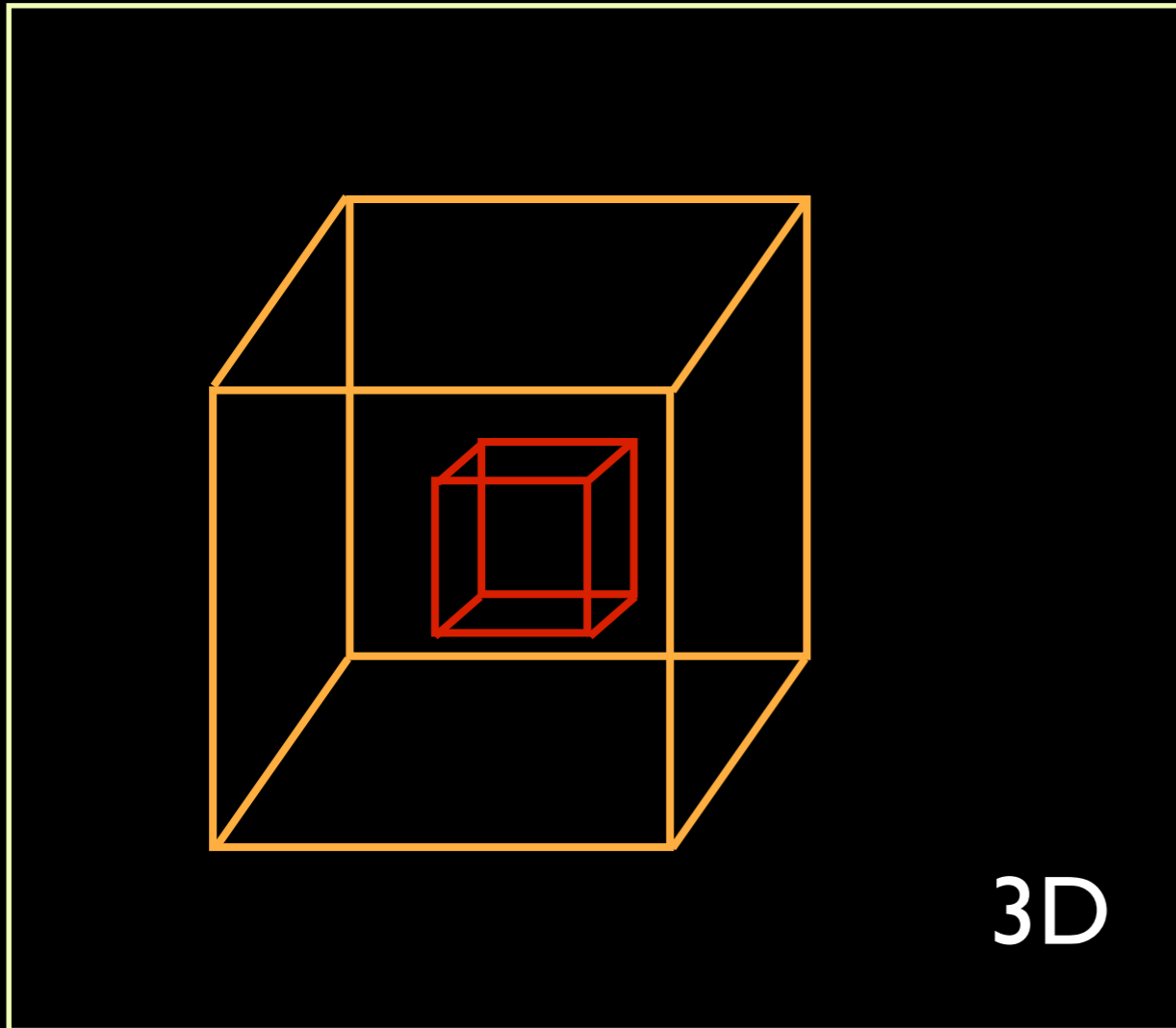
2009
3D PDF

VAST

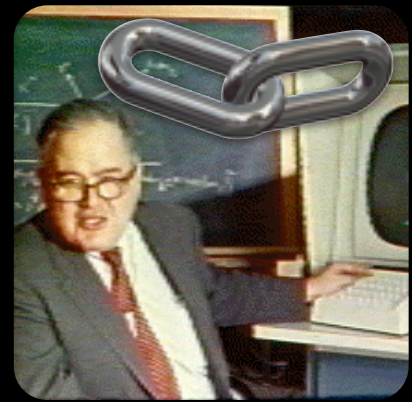
Linked Views of High-dimensional Data



John Tukey



JOHN TUKEY'S LEGACY



PRIM-9

PRIM-H

DataDesk®



XGobi

GGobi

RGGobi



IEEE VIS
established

1970

1980

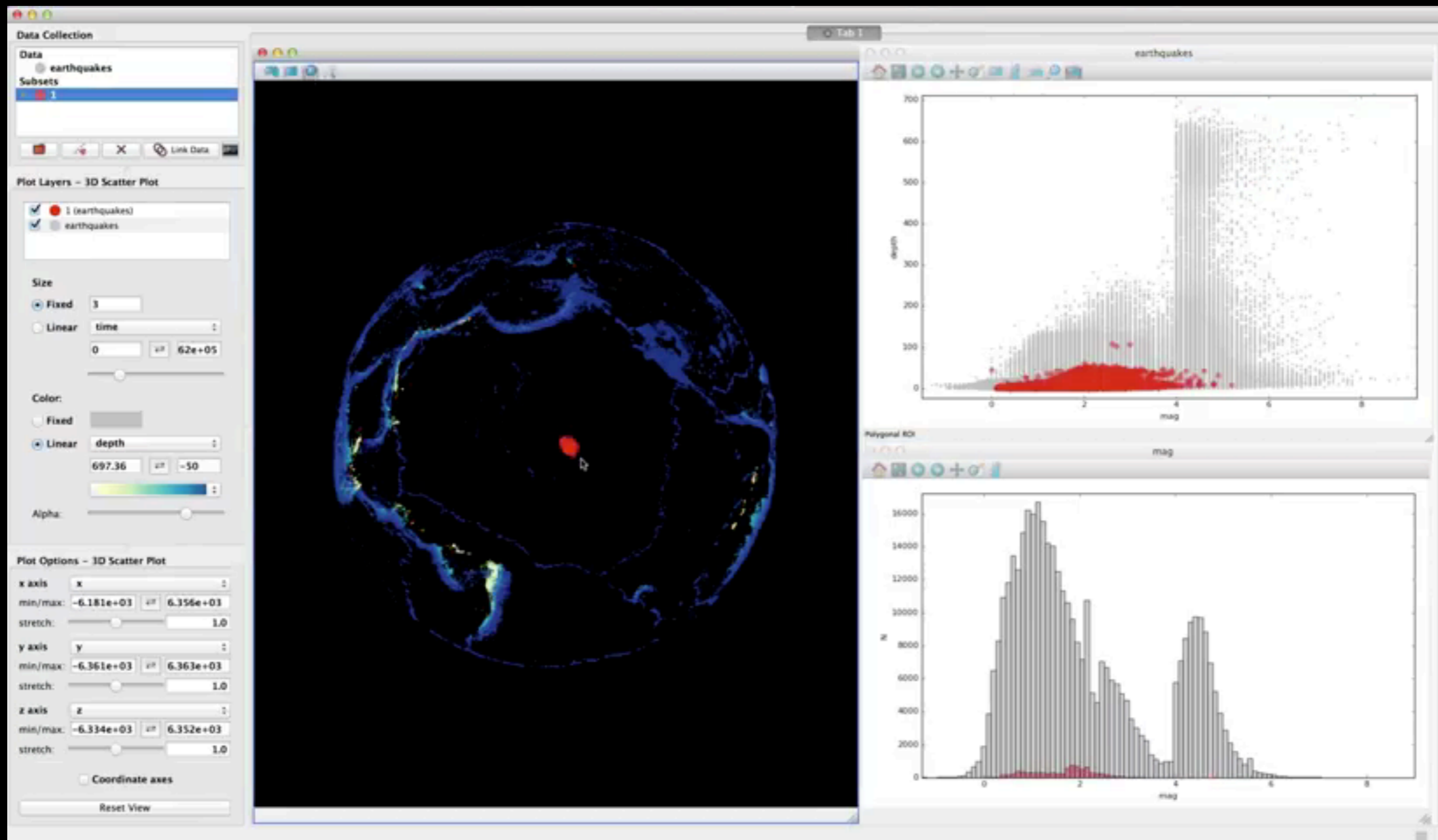
1990

2000

2010

Linked Views of High-dimensional Data (in Python)

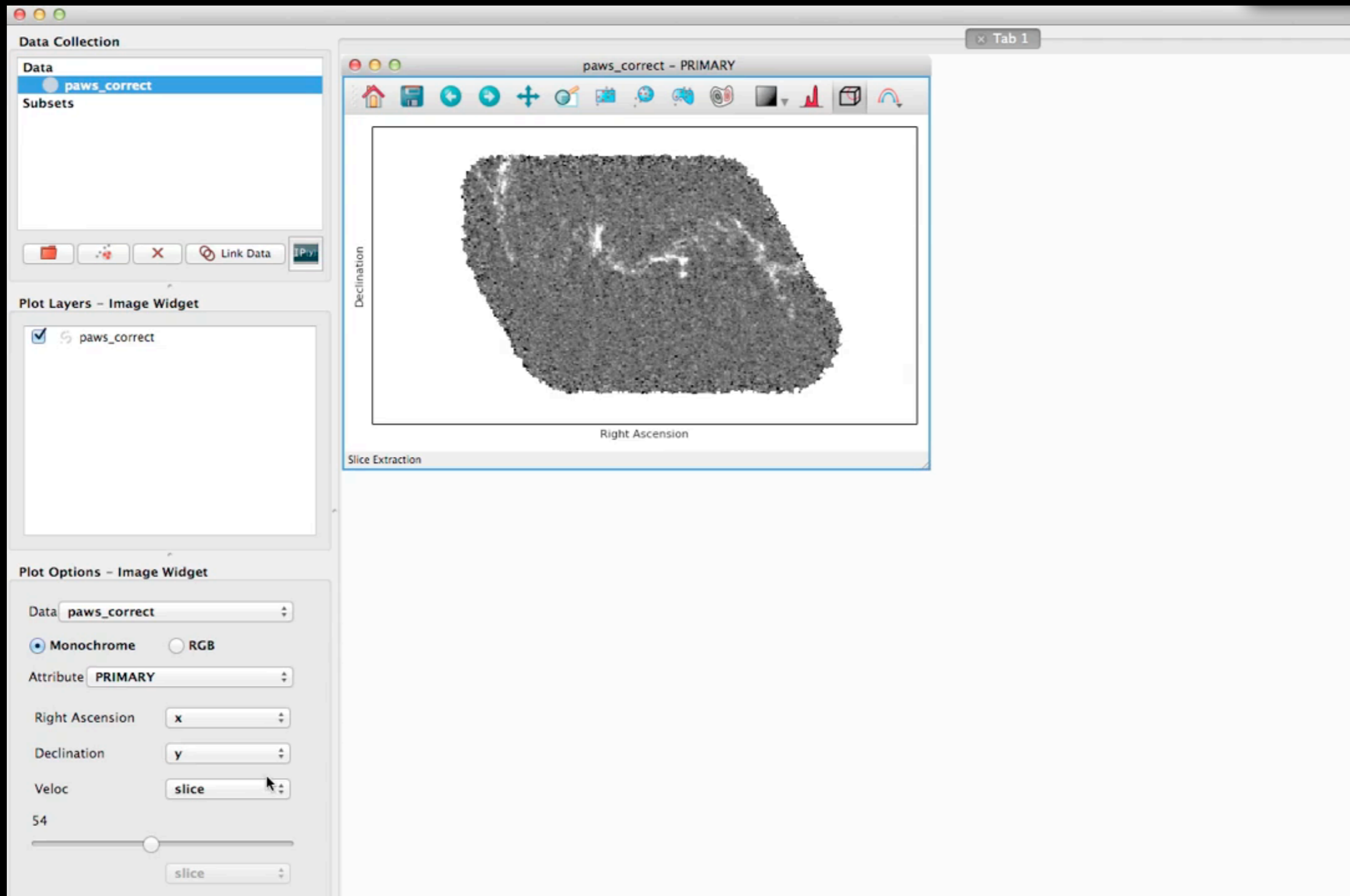
glue



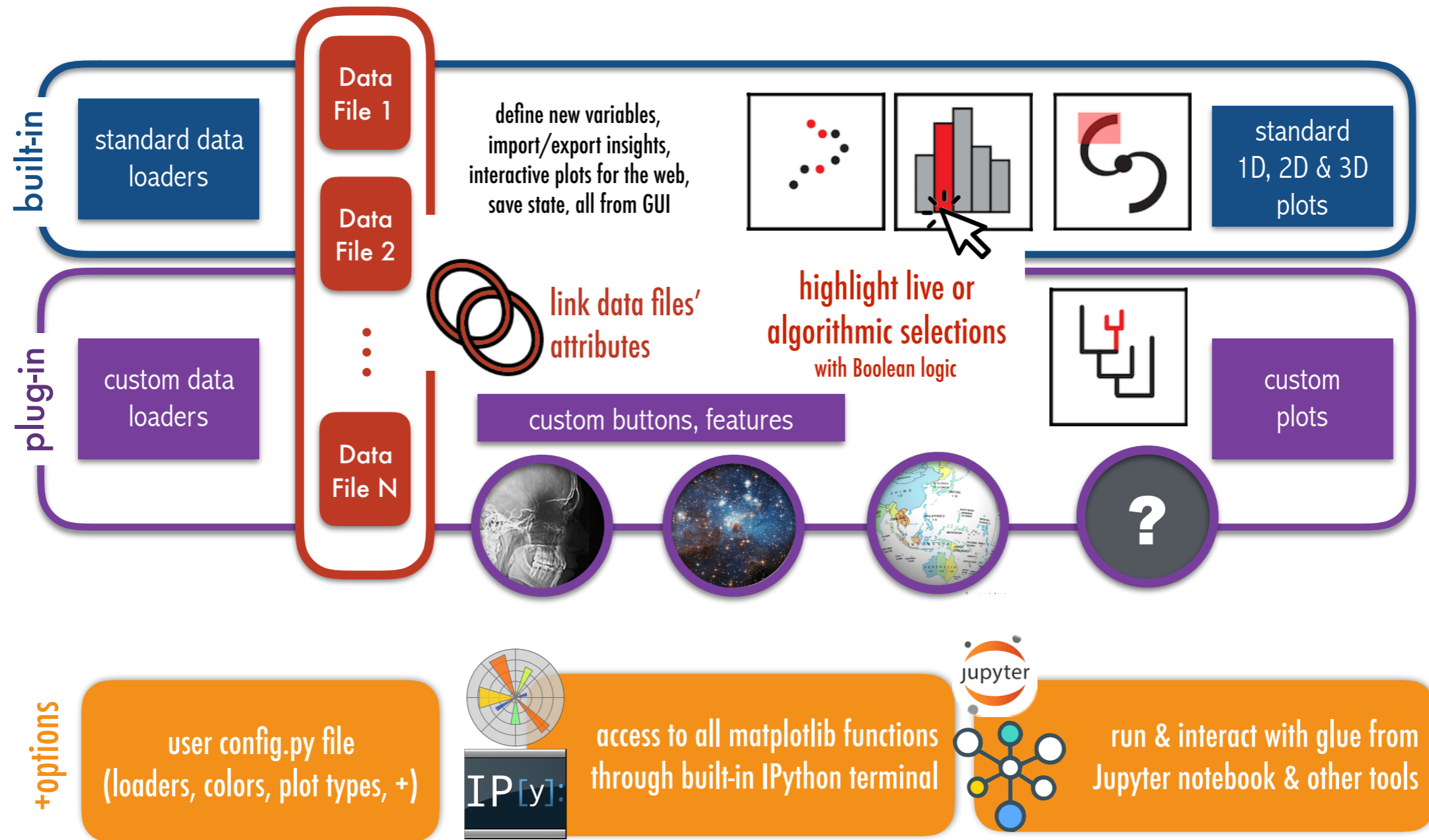
video by Tom Robitaille, lead glue developer
glue created by: C. Beaumont, M. Borkin, P. Qian, T. Robitaille, and A. Goodman, PI

Linked Views of High-dimensional Data (in Python)

glue



*video by Chris Beaumont, glue developer
glue created by: C. Beaumont, M. Borkin, P. Qian, T. Robitaille, and A. Goodman, PI*



glueviz.org

[demo]
[ALMA]
[publishing]

Data Collection

Data

- PerA_12coFCRAO_F_xyv
- PerA_13coFCRAO_F_xyv
- Perseus_Av_NICER
- PerA_AvTemMIPS_F_Av
- PerA_AvTemMIPS_F_T
- Perseus_fcrao_iras_2mass

Subsets

- spec_probe
- hot_highv
- Subset 3

Plot Layers - 2D Scatter

- Subset 3 (Perseus_fcrao_iras_2mass)
- hot_highv (Perseus_fcrao_iras_2mass)
- spec_probe (Perseus_fcrao_iras_2mass)
- Perseus_fcrao_iras_2mass

Color Points Line Errors Vectors

color Fixed

opacity

Plot Options - 2D Scatter

General Limits Axes

x axis V13CO log

y axis TIRAS log

Link Editor

Click on two datasets to set up links or click on an existing connection to edit links. Selected datasets are shown in green. When one dataset is selected, the colors show directly and indirectly linked (blue) and inaccessible (red) datasets.

Datasets

- PerA_AvTemMIPS_F_Av
- PerA_12coFCRAO_F_xyv

Current Links

Function	Component 1	Component 2
identity	Right Ascension	Right Ascension
identity	Declination	Declination

Glue Unglue

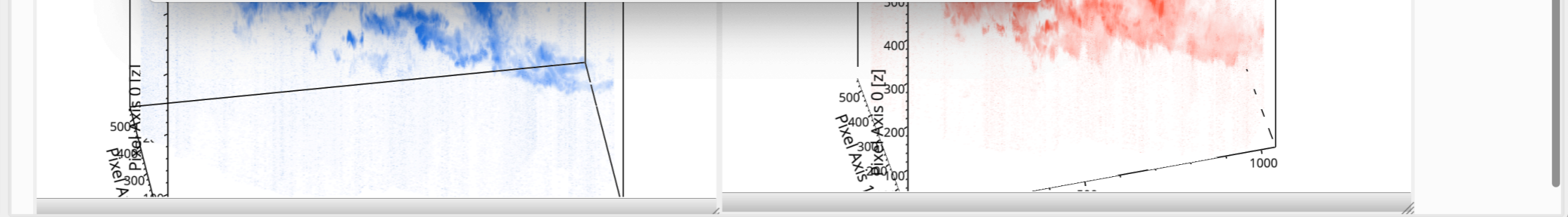
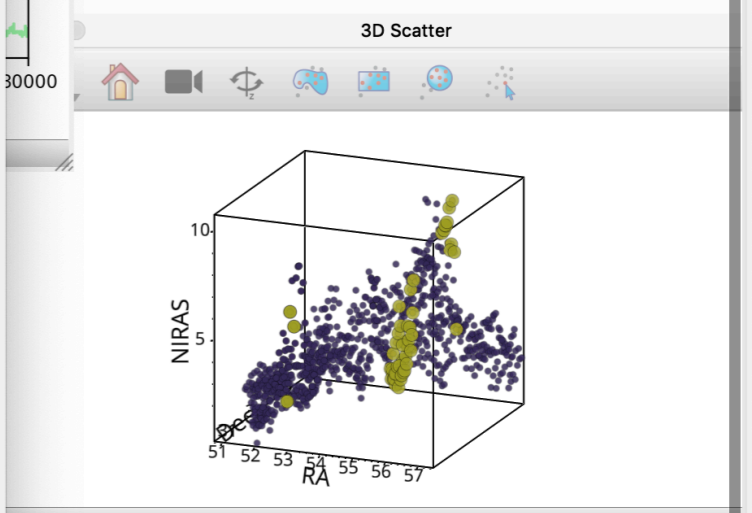
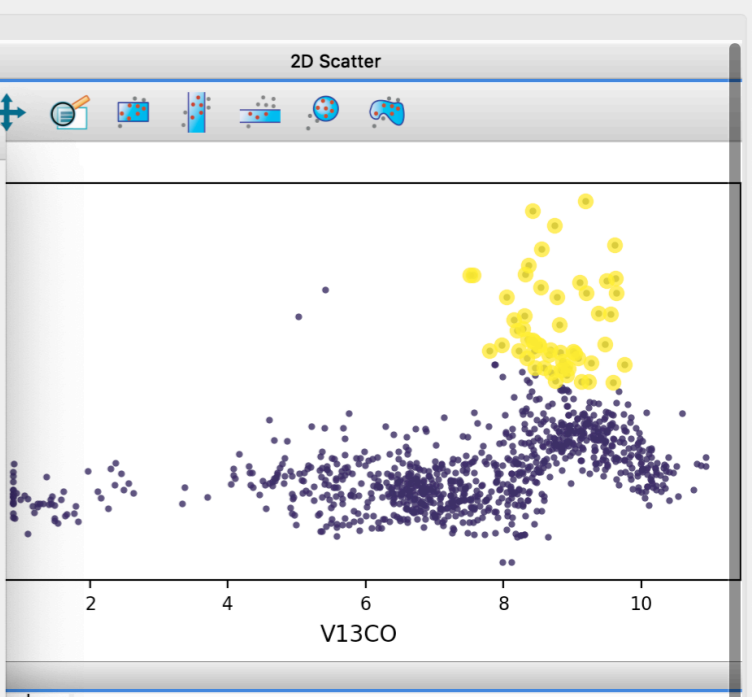
Advanced linking Cancel OK

Data File 1

Data File 2

...

Data File N



No merging of data sets—just glue them.

The screenshot shows the Glueviz application window. The top menu bar includes 'python', 'File', 'Edit', 'View', 'Canvas', 'Data Manager', 'Plugins', and 'Help'. The title bar reads 'Glue'. The top toolbar contains icons for 'Open Data', 'Export Data/Subsets', 'Link Data', 'IPython Terminal', 'Open Session', 'Export Session', and 'Add/edit arithmetic attributes'. The 'Data Collection' panel on the left lists two data sets: 'meth_cube_hdrfixed' and 'onh2d_cube_hdrfixed', with the latter selected. Below it are 'Subsets', 'Plot Layers', and 'Plot Options' panels. The main canvas area is empty and contains the text 'Drag Data To Plot'. The bottom left corner features the text 'An ALMA core'. The system tray at the top right shows the date 'Tue May 29 10:39 PM', the user 'Alyssa A Goodman', and the name 'Jorma Harju'.

Drag Data To Plot

An ALMA core

Just drag to visualize, e.g. series of 2D "channel maps."

The screenshot shows the Glueviz application window. The top menu bar includes 'python', 'File', 'Edit', 'View', 'Canvas', 'Data Manager', 'Plugins', and 'Help'. The top toolbar contains various icons for file operations and data management. The left sidebar is divided into three sections: 'Data Collection', 'Plot Layers', and 'Plot Options'. The 'Data Collection' section lists two data series: 'meth_cube_hdrfixed' (selected) and 'onh2d_cube_hdrfixed'. The main plot area is currently empty and displays the text 'Drag Data To Plot' in a large, light gray font. The bottom left corner of the image contains the text 'An ALMA core'.

An ALMA core

Adjust so each tracer is a different color.

python File Edit View Canvas Data Manager Plugins Help

Open Data Export Data/Subsets Link Data IPython Terminal Open Session Export Session Add/edit arithmetic attributes Selection Mode: Preferences

Data Collection

Data

- meth_cube_hdrfixed
- onh2d_cube_hdrfixed

Subsets

Plot Layers - 2D Image

- meth_cube_hdrfixed (PRIMARY)

attribute: PRIMARY

limits: Custom Arcsinh

0 1.1412

color/opacity: [red color swatch] Sync

contrast/bias: [contrast sliders] Reset

Plot Options - 2D Image

General Limits Axes

mode: One color per layer

aspect: Square Pixels

reference: meth_cube_hdrfixed

x axis: Right Ascension

y axis: Declination

Vrad Show real coordinates

4300.0 m/s

2D Image

methanol

2D Image

o-NH₂D

Create 3D views...

python File Edit View Canvas Data Manager Plugins Help

Open Data Export Data/Subsets Link Data IPython Terminal Open Session Export Session Add/edit arithmetic attributes Selection Mode: Preferences

Data Collection

Data

- meth_cube_hdrfixed
- onh2d_cube_hdrfixed

Subsets

Plot Layers - 3D Volume Rendering

- meth_cube_hdrfixed

Attribute: PRIMARY

Limits: 0 1.1412

Color: [Red]

Plot Options - 3D Volume Rendering

x axis: Pixel Axis 2 [x]

min/max: -0.5 511.5

stretch: 1.00

y axis: Pixel Axis 1 [y]

min/max: -0.5 511.5

stretch: 1.00

z axis: Pixel Axis 0 [z]

min/max: -0.5 12.5

stretch: 10.00

resolution: 256

- Native aspect ratio
- Perspective
- Show axes
- Downsample when panning

2D Image

methanol

Declination

Right Ascension

3D Volume Rendering

Pixel Axis 0 [z]

Pixel Axis 1 [y]

Pixel Axis 2 [x]

...see clearly "veil" of wind-blown methanol.

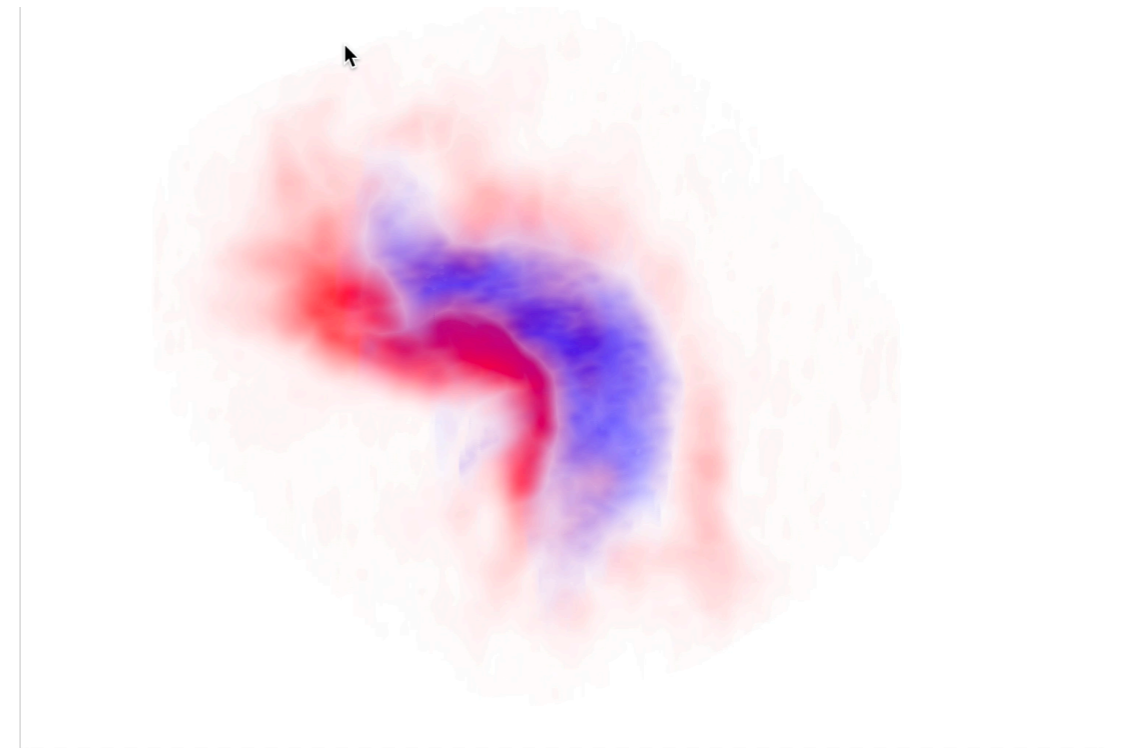
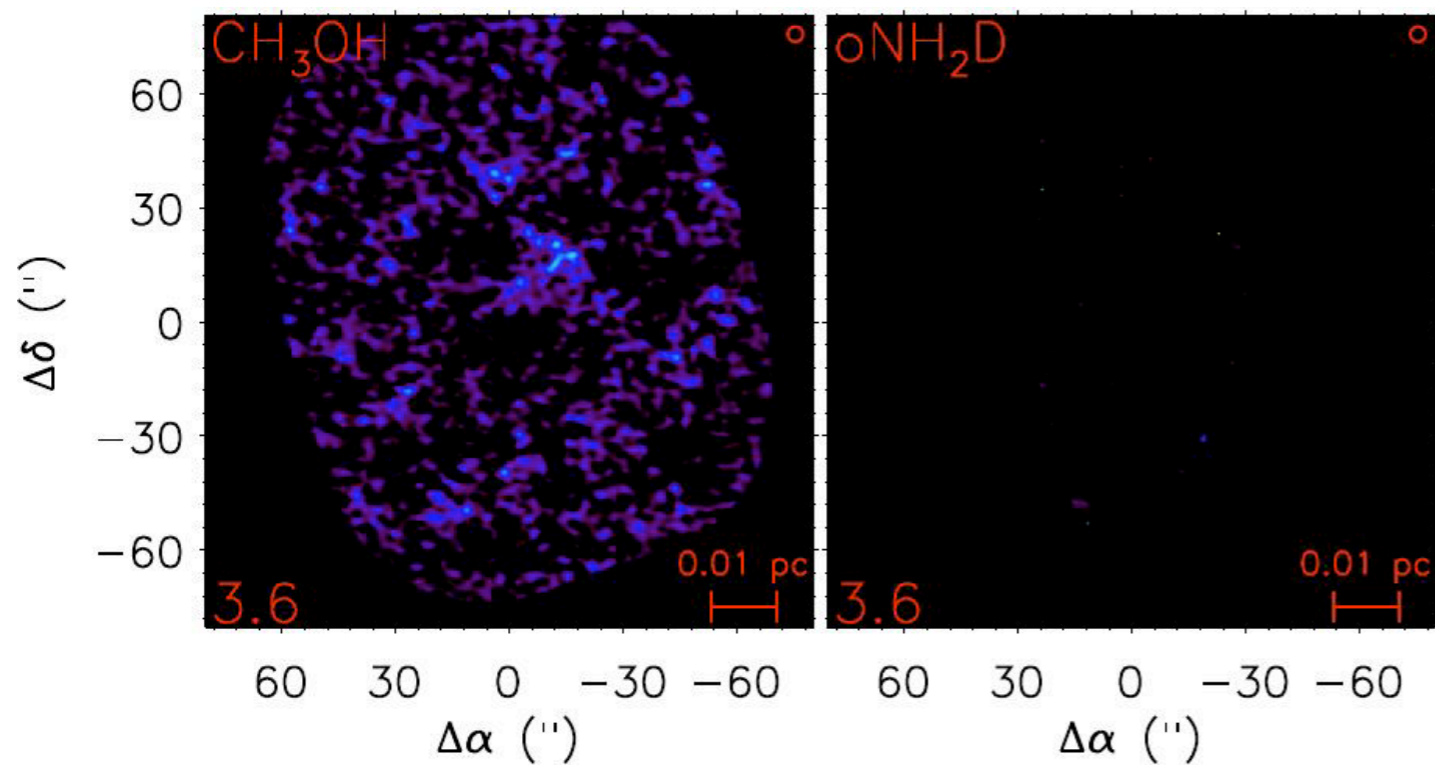
Declination

Right Ascension

O=NC

Traditional Rainbow Channel maps

glue



Scripting

Glue

Open Data Export Data/Subsets Link Data IPython Terminal Open Session Export Session Add/edit arithmetic attributes Selection Mode: Preferences

Data Collection

Data

- x90y40_NH2_0deg
- x90y40_nH2
- x90y40_filmask_0deg

Subsets

- filmask_zero

Plot Layers - 3D Volume Rendering

- filmask_zero (x90y40_nH2)
- x90y40_nH2

Attribute: PRIMARY

Color: [Color Picker]

Subset: Data Outline

2D Image

3D Volume Rendering

```
~/Google Drive/Glue Stuff/SimFil_Glue] aagoodman% python3 simfil_startup.py 'x90y40'
```

x axis Pixel Axis 2 [x]

min/max: -28.5749 ⇌ 527.575

stretch: 1.00

y axis Pixel Axis 1 [y]

min/max: -28.5749 ⇌ 527.575

stretch: 1.00

z axis Pixel Axis 0 [z]

min/max: -28.5749 ⇌ 527.575

stretch: 1.00

resolution: 256

Native aspect ratio

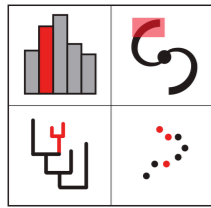
Perspective Show axes

Downsample when panning

2015: The "Paper" of the Future

The screenshot shows the Authorea web interface. At the top, the Authorea logo is on the left, and navigation links for 'FEATURED ARTICLES', 'ABOUT', 'PLANS', 'BLOG', 'FEEDBACK', 'HELP', and 'ALYSSA GOODMAN' are on the right. Below the navigation, there are status indicators for 'PUBLIC' and 'ROUGH DRAFT', and utility links for 'Index', 'Settings', 'Fork', 'Quickedit', 'Word Count', '42 Comments', 'Export', and 'Unfollow'. The main article title is 'The "Paper" of the Future'. The authors listed are Alyssa Goodman, Josh Peek, Alberto Accomazzi, Chris Beaumont, Christine L. Borgman, How-Huan Hope Chen, Merce Crosas, Christopher Erdmann, August Muench, Alberto Pepe, and Curtis Wong. There are buttons to 'Add author' and 'Re-arrange authors'. A note mentions a 5-minute video demonstration available at a YouTube link. The article content begins with a section titled '1 Preamble', discussing human cognition and the future of scholarly communication. A large image at the bottom of the article features a brain with the word 'Cognition' and the text 'Paper of the Future'. On the right side, there are three comments from Konrad Hinsien and Merce Crosas. On the left side, there is a vertical stack of icons: a portrait of Galileo, the Authorea logo, the 'glue' logo, and a blue sphere icon.





glue
multidimensional data exploration

enabled by d3.js (javascript) outputs



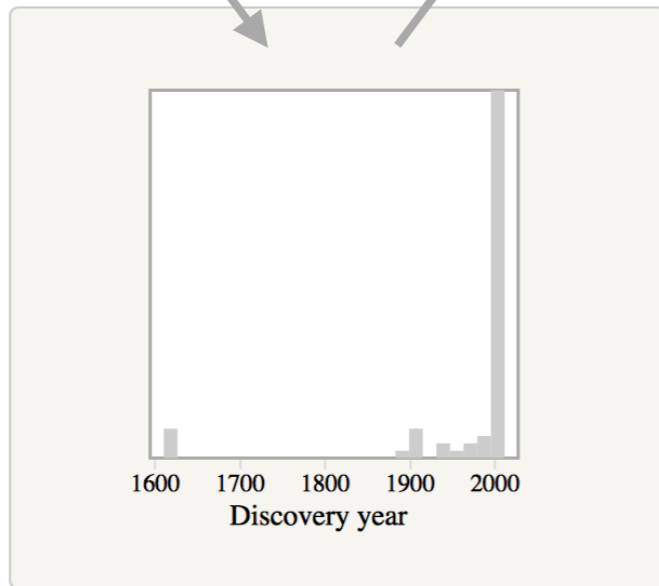
d3po

d3po is a project designed to allow an astronomer (or anyone), with no special data visualization skills, to make an interactive, publication-quality figure that has staged builds and linked brushing through scatter plots. Our current version can be previewed at d3po.org, and represents a figure from upcoming work by graduate student Elisabeth Newton. The figure describes how metallicity affects color in cool stars, and represents a nice use case for d3po. Try clicking and dragging in the scatter plots to understand the power of linked brushing in published figures.

Right now we are in search of alpha testers, who have figures that could be made interactive and who are willing to get their hands a little dirty (No javascript skills needed). In future versions, we plan to link to [glue](#) to allow the creation of d3po figures interactively. We are also exploring [implementation](#) of d3po within presentations and within [authorea](#). Full 1.0 version expected in January 2014.

Installing your own d3po server

```
git clone git@github.com:adrm/d3po.git
cd d3po
virtualenv --no-site-packages venv
source venv/bin/activate
pip install -r pip-requirements.txt
python run.py
```



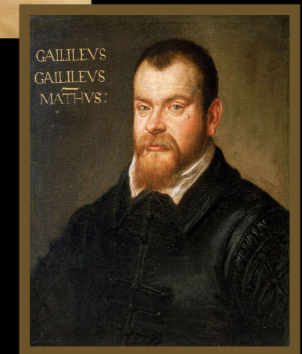
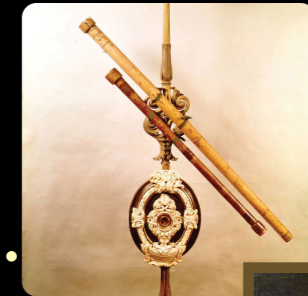
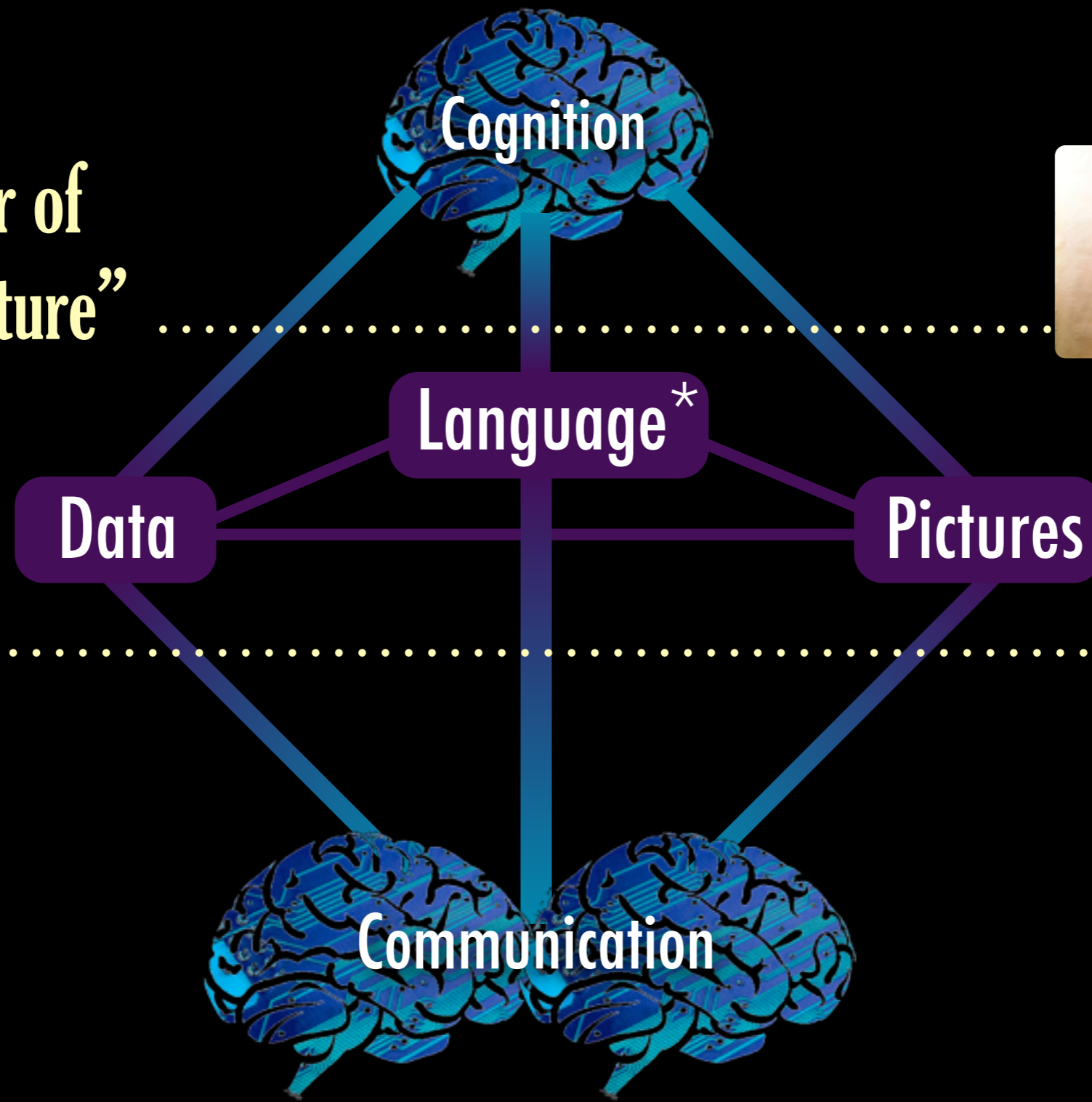
- Four Centuries of Discovery
- A Chasm in Mass
- Little Siblings
- Close Cousins
- The Strangers

After Galileo discovered the first four moons of Jupiter, it took nearly three hundred years to discover the next one.

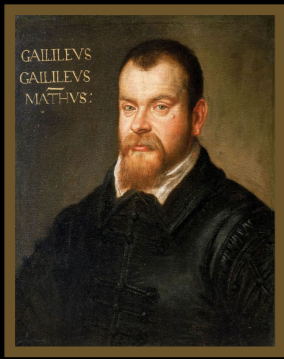
[demo]

Many thanks to Alberto Pepe, Josh Peek, Chris Beaumont, Tom Robitaille, Adrian Price-Whelan, Elizabeth Newton, Michelle Borkin & Matteo Cantiello for making this possible.

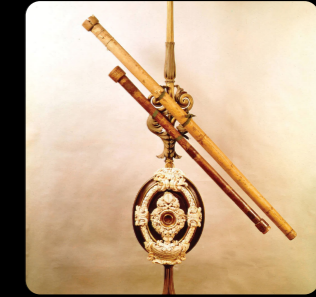
“Paper of
the Future”



*“Language” includes words & math



1610: Why Galileo is My Hero (Explore-Explain-Explore)



Sc^{to} Principe.

Galileo Galilei, Famili^o Seruo della Ser^{ta} V: inuigilanza
do assiduo, et de ogni spirito se bonere no solo satisfare
alvario che non della letura de Mathematici nelle stu-
dio di Padoua,

Inuice dauere determinato di presentare al Sc^{to} Principe
l'vchiale et il p^o essere di giouamento inestimabile di ogni
regio et in circa marittima o terrestre stimo di tenere quel
che nouo artificio ne l' maggior segreto et solam a disposizione
di u^o Ser^{ta} L'vchiale conato dalle piu u^o di ite speculazioni di
prospettua ha l'uantaggio di scoprire Legni et Vele dell' inimico
p^o ue hore et piu di tempo prima che egli sia sopra noi et distinguendo
il numero et la qualita de i vasselli giudicare la sua forte
pallestirsi alla caccia al combattimento o alla fuga, o pure esser
nella campagna aperta uidero et particolarmente distinguere ogni suo
moto et preparatione.

Adi 7. di gennaio
Gioue si uede u^o * * * * *

Adi 8. u^o * * * * *

Adi 11. si uede in tale u^o * * * * *

Adi 13. si uede u^o in Gioue 4 stelle * * * * *

Adi 14. è angelo * * * * *

Adi 15. * * * * * la p^ossi a 4 ora in u^o la 4^a ora di
stante dalla 3^a il gruppo di u^o

Lo spazio delle 3 u^o di u^o in
maggiore del diametro di 7^o et c^o
u^o in linea retta.

7. Aug. 1610. Gal. 115

East		West	
7	* * ○ *	17	* ○
8	○ * * *	18	* ○ *
10	* * ○	19	* ○ * *
11	* * ○	19	* ○ * *
12	* ○ *	20	○ * ○ ○
13	* ○ * *	21	... ○
15	○ * * * *	22	* ○ * *
15	○ * * *	22	* ○ * *
16	* ○ *	23	* ○ * *
17	* ○ *	24	* ○ * *

SIDEREUS NUNCIUS 75

On the third, at the seventh hour, the stars were arranged in this sequence. The eastern one was 1 minute, 30 seconds from Jupiter; the closest western one 2 minutes; and the other western one was 10 minutes removed from this one. They were absolutely on the same straight line and of equal magnitude.

On the fourth, at the second hour, there were four stars around Jupiter, two to the east and two to the west, and arranged precisely on a straight line, as in the adjoining figure. The easternmost was distant 3 minutes from the next one, while this one was 40 seconds from Jupiter; Jupiter was 4 minutes from the nearest western one, and this one 6 minutes from the westernmost one. Their magnitudes were nearly equal; the one closest to Jupiter appeared a little smaller than the rest. But at the seventh hour the eastern stars were only 30 seconds apart. Jupiter was 2 minutes from the nearer eastern one, while he was 4 minutes from the next western one, and this one was 3 minutes from the westernmost one. They were all equal and extended on the same straight line along the ecliptic.

On the fifth, the sky was cloudy.

On the sixth, only two stars appeared flanking Jupiter, as is seen in the adjoining figure. The eastern one was 2 minutes and the western one 3 minutes from Jupiter. They were on the same straight line with Jupiter and equal in magnitude.

On the seventh, two stars stood near Jupiter, both to the east, arranged in this manner.

2018: 10QViz.org

≡ MENU



TEN QUESTIONS TO ASK WHEN CREATING A VISUALIZATION

The 10 Questions

1. **Who** | Who is your audience? How expert will they be about the subject and/or display conventions?
2. **Explore-Explain** | Is your goal to explore, document, or explain your data or ideas, or a combination of these?
3. **Categories** | Do you want to show or explore pre-existing, known, human-interpretable, categories?
4. **Patterns** | Do you want to identify new, previously unknown or undefined patterns?
5. **Predictions & Uncertainty** | Are you making a comparison between data and/or predictions? Is representing uncertainty a concern?
6. **Dimensions** | What is the intrinsic number of dimensions (not necessarily spatial) in your data, and how many do you want to show at once?
7. **Abstraction & Accuracy** | Do you need to show all the data, or is summary or abstraction OK?
8. **Context & Scale** | Can you, and do you want to, put the data into a standard frame of reference, coordinate system, or show scale(s)?
9. **Metadata** | Do you need to display or link to non-quantitative metadata? (including captions, labels, etc.)
10. **Display Modes** | What display modes might be used in experiencing your display?

 **Join the 10QViz Conversation!** 

To learn more about this site, please visit the [About](#) page.

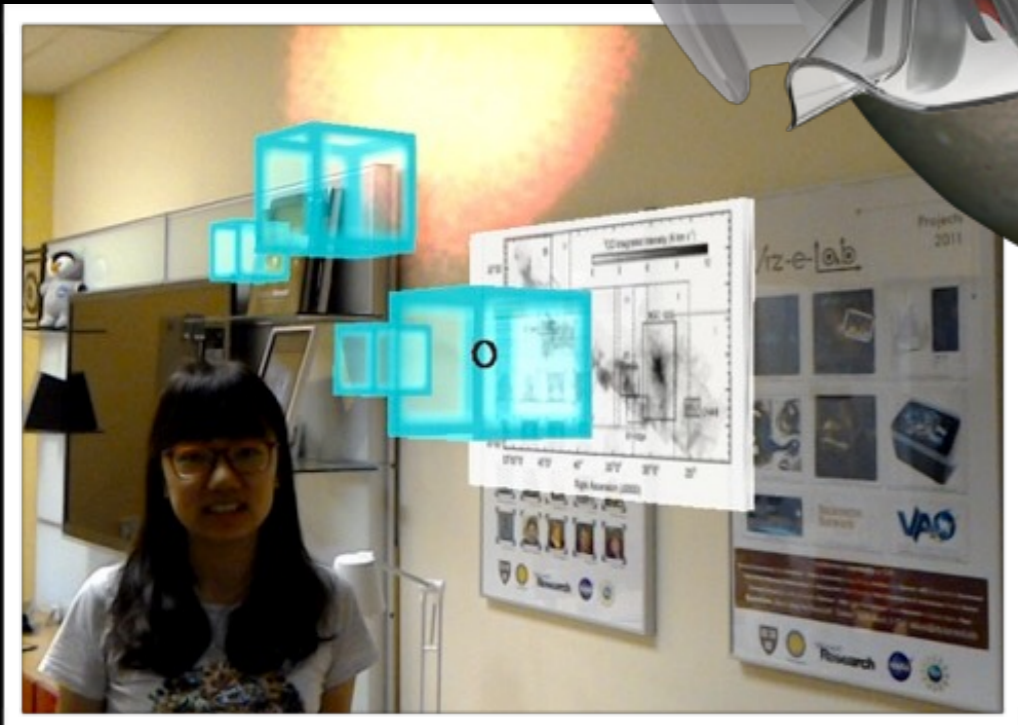
To read an in-process manuscript giving the scholarship behind the recommendations on this site, see [Coltekin & Goodman 2018](#).

2019: glue in the browser

The screenshot displays the JupyterLab web interface. On the left, a histogram shows the distribution of data points along the z-axis, with the y-axis labeled 'Number' ranging from 0.00 to 70.00. Below the histogram, a code cell contains the command `app.scatter3d('x', 'y', 'z');`. In the center, a 3D scatter plot shows a cluster of points within a wireframe box. On the right, an 'Output View' window shows a scatter plot of points with a brush tool active. A central dialog box titled 'Start a new activity' is overlaid, providing three options: 'Notebook', 'Code Console', and 'Text Editor'. The JupyterLab logo and version 'alpha (v0.23.2)' are visible above the dialog. The 'glupyter' logo is in the bottom left corner.

Video courtesy of Maarten Breddels, consulting developer

The challenge of 3D Selection



DATA,
CODE,
COLLABORATION



DATA-DRIVEN STORYTELLING



shared data

public outreach

scholarly publication

**open source,
modular,
software**

**collaborative
software
development**



**combined
data
sources**

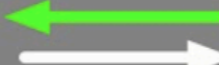
EXPLANATION

**linked-view EXPLORATORY
analysis of high-dimensional data**

**plug-in
architecture**

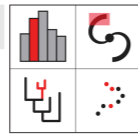


EXPLORATION



EXPLANATION





glue
multidimensional data exploration

Linked-View Exploratory Visualization of High-Dimensional Data, for Everyone

Alyssa Goodman (PI, Harvard)
Michelle Borkin (PI, Northeastern)
Thomas Robitaille (Lead Architect)

The glue project was founded in 2012, with funding from NASA's James Webb Space Telescope (JWST) project. NASA contracts continue to support development of JWST-related (Astronomy) functionality.

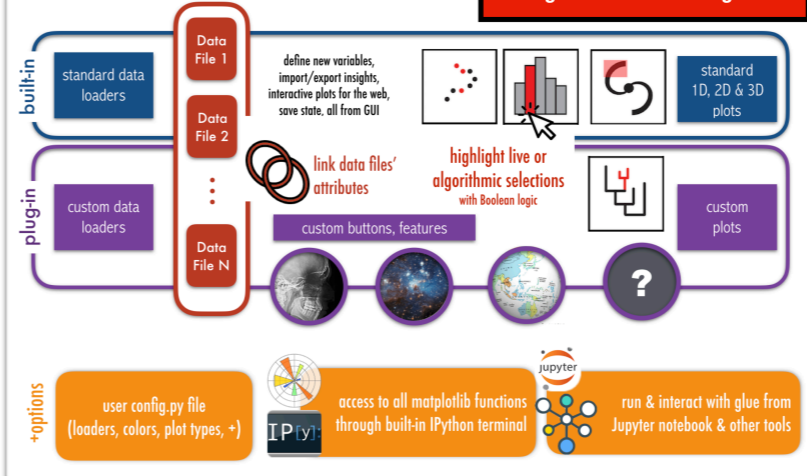
Beginning in 2017, glue has also been funded by the National Science Foundation, under SI2-SSE 1739657/1740229: Collaborative Research: A sustainable future for the glue multi-dimensional linked data visualization package. The goal of the NSF SSE funding is to expand glue's functionality into domains beyond its traditional strengths in Astronomy and Medicine, by broadening both its user and developer communities. All glue code is Open Source, at github.com/glue-viz

glueviz.org

github.com/glue-viz

glueviz.slack.com

glue's modular design



Linked Visualizations
With Glue, users can create scatter plots, histograms and images (2D and 3D) of their data. Glue is focused on the brushing and linking paradigm, where selections in any graph propagate to all others.



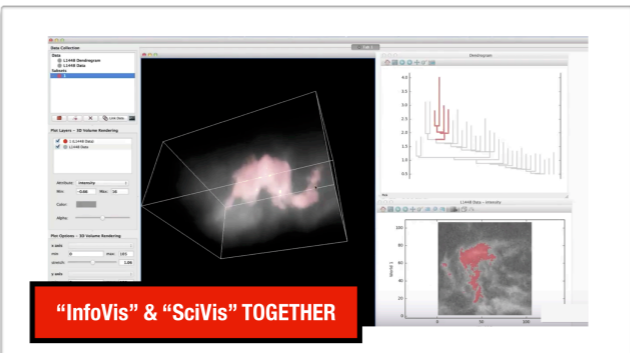
Flexible linking across data
Glue uses the logical links that exist between different data sets to overlay visualizations of different data, and to propagate selections across data sets. These links are specified by the user, and are arbitrarily flexible



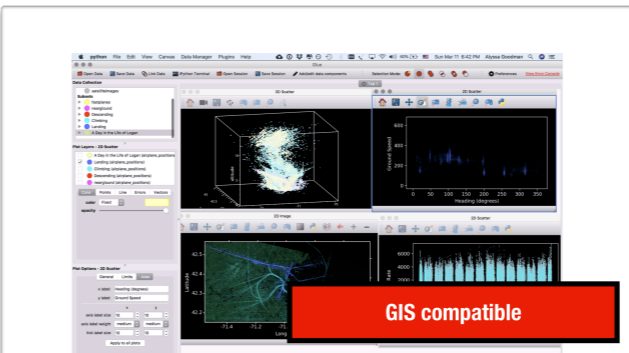
Full scripting capability
Glue is written in Python, and built on top of its standard scientific libraries (i.e., Numpy, Matplotlib, Scipy). Users can easily integrate their own python code for data input, cleaning, and analysis.

Want to plug-in your project or tool?
Consider joining us for **glue-con**, right after **JupyterCon**, August 27-29, 2018, at **Harvard**.

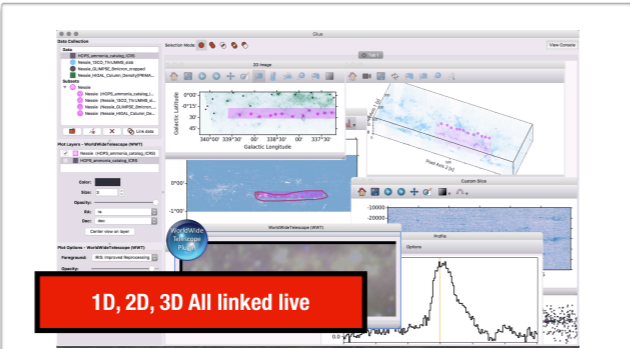
glue-con
2018, CAMBRIDGE, MA
projects.iq.harvard.edu/gluecon



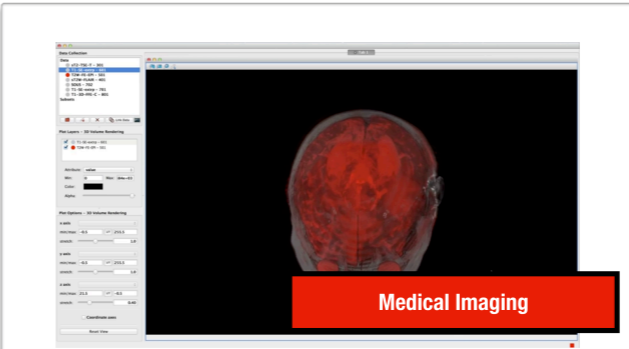
"InfoVis" & "SciVis" TOGETHER



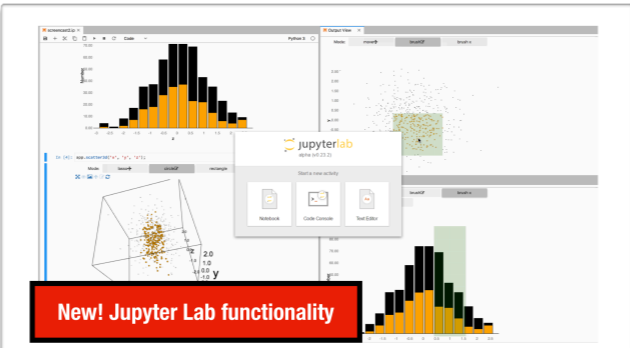
GIS compatible



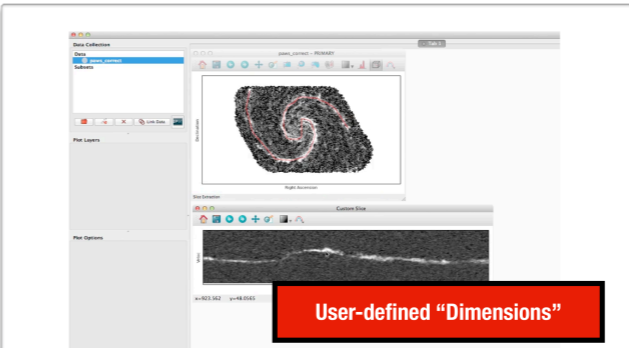
1D, 2D, 3D All linked live



Medical Imaging



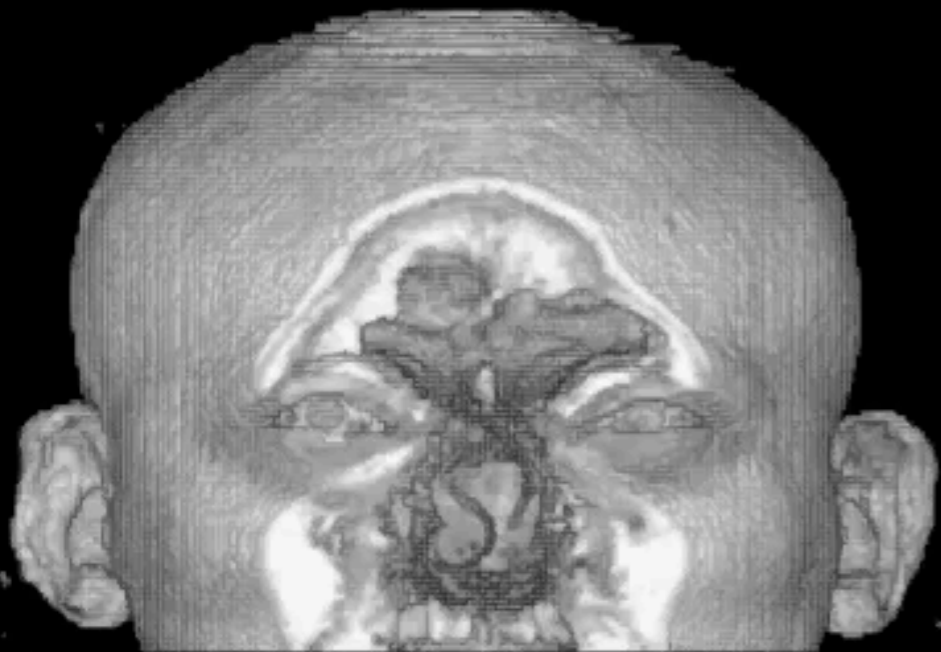
New! Jupyter Lab functionality



User-defined "Dimensions"

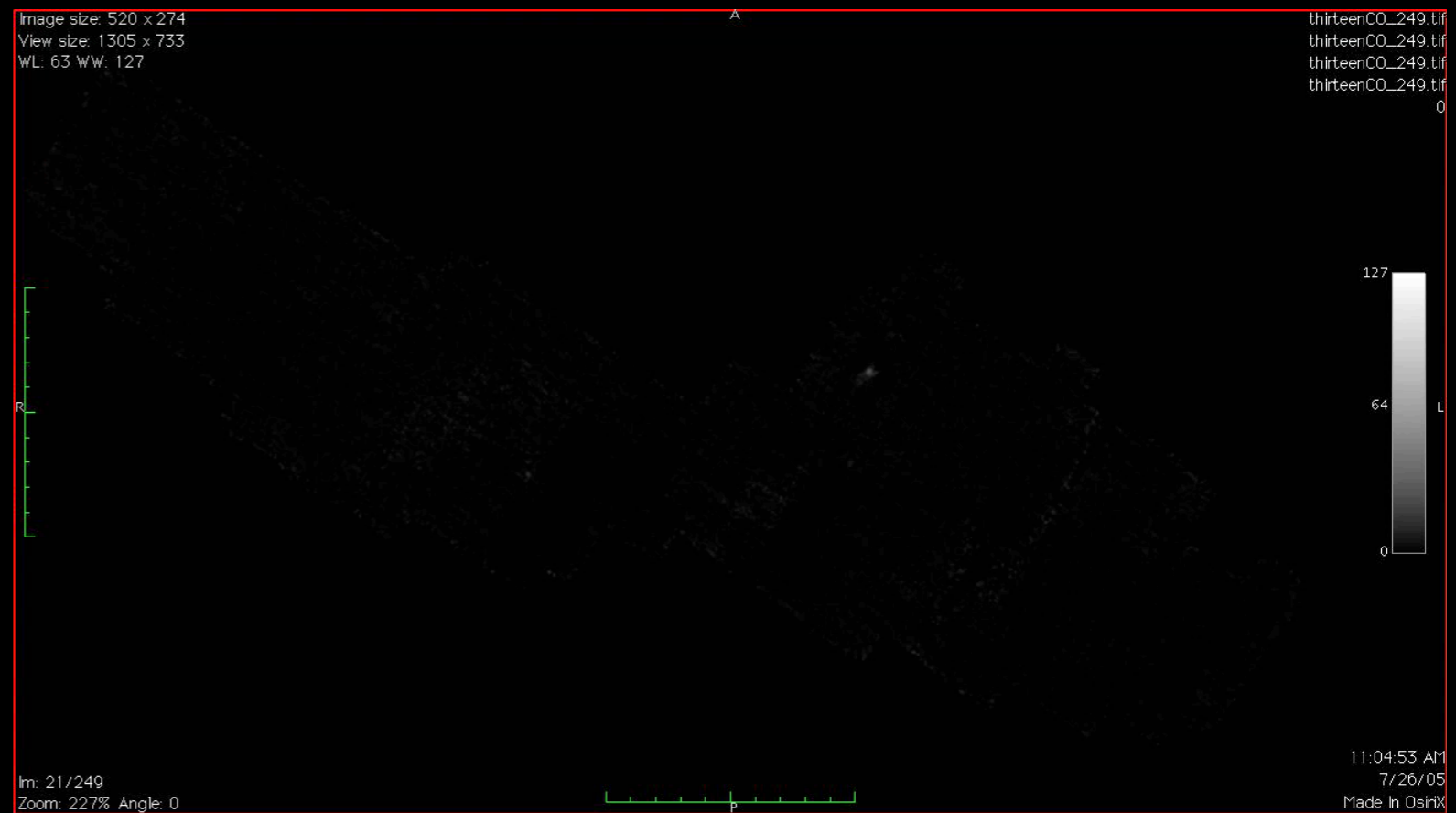
ASTRONOMICAL MEDICINE

"KEITH"



"z" is depth into head






"PERSEUS"

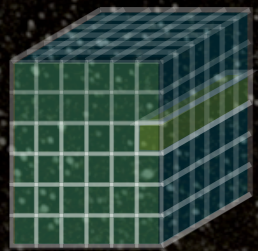


"z" is line-of-sight velocity

Image size: 520 x 274
View size: 1305 x 733
W/L: 63 WW: 127

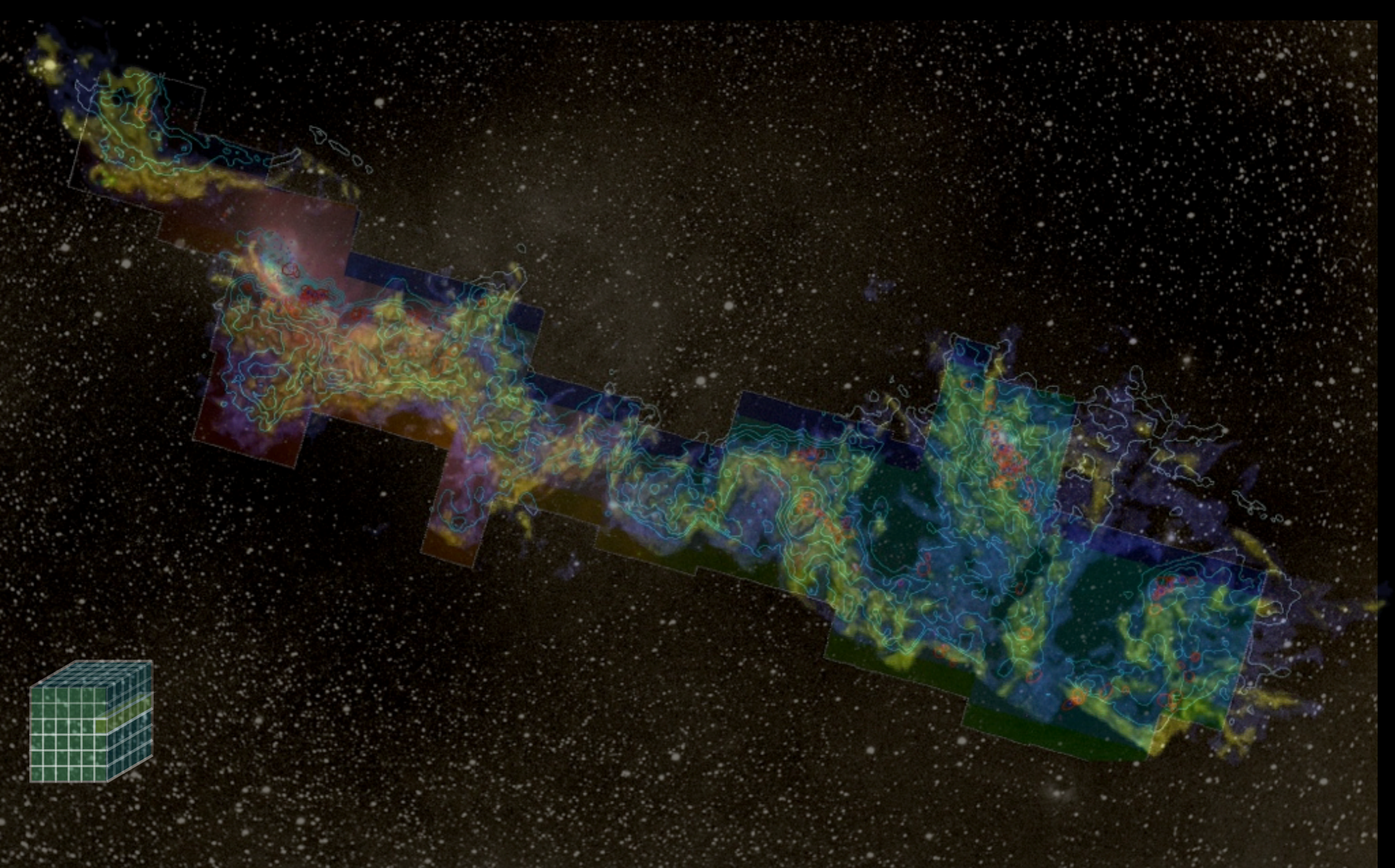
ASTRONOMICAL MEDICINE

-  mm peak (Enoch et al. 2006)
-  sub-mm peak (Hatchell et al. 2005, Kirk et al. 2006)
-  ^{13}CO (Ridge et al. 2006)
-  mid-IR IRAC composite from c2d data (Foster, Laakso, Ridge, et al.)
-  Optical image (Barnard 1927)



m: 1/249
Zoom: 227% Angle: 0





3D Viz made with VolView

Traditionally, travel from exploration to explanation is called “Scholarly Publishing” if its *dry*, and “Public Outreach,” if it’s *beautiful*.

Explore



Explain

Explore



Explain

It's much harder to go the other way.

Explore

And, the *best* roads are two-way.

Explain